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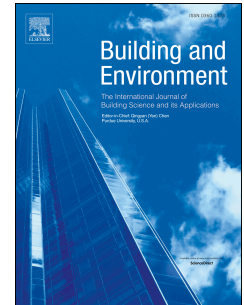
### Article publicat / Published paper:

Tejedor, B. [et al.]. U-value time series analyses: Evaluating the feasibility of in-situ short-lasting IRT tests for heavy multi-leaf walls. *Building and environment*, 15 Juliol 2019, vol. 159, p. 1-19. DOI: <[10.1016/j.buildenv.2019.05.001](https://doi.org/10.1016/j.buildenv.2019.05.001)>.

# Accepted Manuscript

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PII: S0360-1323(19)30311-7

DOI: <https://doi.org/10.1016/j.buildenv.2019.05.001>

Reference: BAE 6123

To appear in: *Building and Environment*

Received Date: 17 February 2019

Revised Date: 2 April 2019

Accepted Date: 1 May 2019

Please cite this article as: Tejedor B, Casals M, Macarulla M, Giretti A, U-value time series analyses: Evaluating the feasibility of in-situ short-lasting IRT tests for heavy multi-leaf walls, *Building and Environment* (2019), doi: <https://doi.org/10.1016/j.buildenv.2019.05.001>.

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# U-value time series analyses: Evaluating the feasibility of in-situ short-lasting IRT tests for heavy multi-leaf walls

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## Abstract

A gap in standardization of quantitative infrared thermography (IRT) directly leads to a lack of measurement pattern for determining in-situ U-values of heavy multi-leaf walls. Three groups of causal factors might influence the estimation of this build quality indicator: operating conditions, thermophysical properties and technical conditions. Focusing on the last one, previous studies underlined the difficulties of measuring below 3 h. In contrast to active IRT, no algorithms have been found to process images, despite playing an important role in the effectiveness and robustness of IRT. The traditional approach involves analysing from 120 to 7200 thermograms with a data acquisition interval of 1 minute up to 1 second respectively. The aim of this paper was to critically assess the test duration that is traditionally used. Six real heavy multi-leaf walls were tested under a stationary regime as a stochastic process of underlying data. For the first time, a research based on two U-value time series analyses (statistical tests and a signal modelling technique by MATLAB) demonstrated the feasibility of short-lasting IRT tests. Moreover, this research posed an innovative data management tool to automate this non-destructive testing (NDT) in mid-term, stopping IRT tests in real time once the right level of accuracy was achieved.

**Keywords:** quantitative infrared thermography (IRT), in-situ U-value, test duration, time-series analysis, white noise, signal modelling

## 1. INTRODUCTION

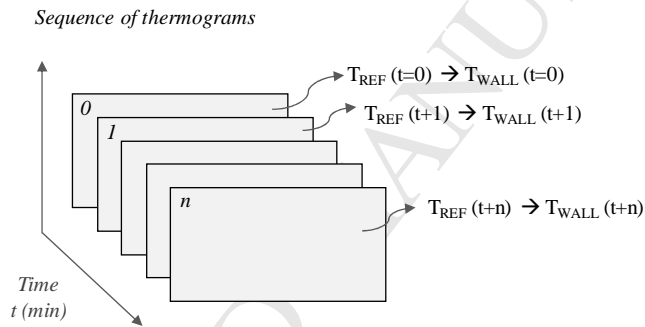
In the last few decades, some researchers have focused on the development and implementation of techniques for assessing building thermal features. Techniques include: simulation [1– 4], the guarded hot box method [5, 6], the automatic guarded hot plate apparatus [7], the heat flux meter method (HFM) [8–15] and infrared thermography (qualitative and quantitative IRT) [16– 28]. In fact, a combination of some of these techniques has been used to complete studies on the influence of boundary conditions on measured U-values [29–34] and to validate results of non-destructive testing (NDT) methods that are not fully developed (i.e. quantitative IRT) [35– 41].

Most of the aforementioned methods have regulations or guidelines on the main requirements and procedures (i.e. guarded hot box: ASTM C177-13 [42], ASTM C1363-11 [43] and UNE-EN ISO 8990:1997 [44]; heat flux meter: ISO 9869:2014 [45]; qualitative IRT: ISO 18434-1:2008 [46], EN 13187:1998 [47] and RESNET Interim Guideline for Thermographic Inspections of Buildings [48]). Recently, ISO 9869-2:2018 [49] has come into force for determining thermal properties (R-value or U-value) of walls with light heat capacity ( $< 30 \text{ kJ/m}^2\cdot\text{K}$ ) using quantitative IRT under stationary regime. According to this standard, the inner wall surface temperature of a frame structure dwelling is measured using an IR camera, while inner air temperature and the total heat transfer coefficient (assuming convection and radiation processes) are determined by sensors. However, there is a gap in the standardization of quantitative IRT for in-situ building diagnostics of heavy multi-leaf walls that still needs to be filled. This gap causes a lack of measurement pattern, which can affect how the method is applied by practitioners, such as energy auditors or other stakeholders in the construction industry field. Implementation of quantitative IRT encompasses aspects relating to operating conditions (outdoor air temperature), thermophysical properties (the kappa value, also called the heat capacity per unit of area) and technical conditions (test duration and data acquisition interval) [50, 51, 52, 36, 39, 29, 25, 53, 34, 54, 55]. In previous studies conducted in laboratories or experimental rooms, the first two aspects might be considered a source of discrepancy in the determination of the measured U-value, regardless of the technique that has been undertaken (simulation, climatic chamber or HFM) [29, 31, 33, 55]. In real built environments, the influence of operating conditions and non-transient thermophysical properties of the wall was recently analysed with respect to the accuracy of quantitative internal IRT for  $\Delta T < 10^\circ\text{C}$  [56]. This temperature difference was considered a limitation for the method [57, 55].

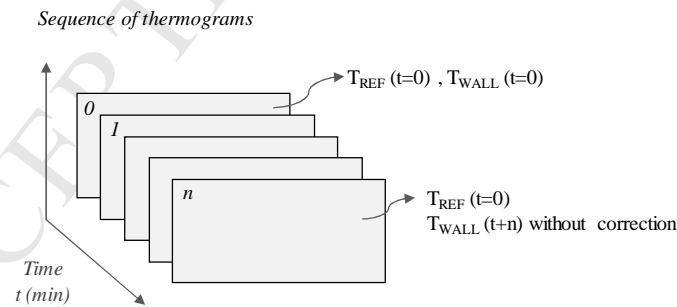
Focusing on technical conditions, some researchers underlined the difficulties in using quantitative IRT tests with a short sampling duration [58, 37, 38, 39, 59, 55, 60, 61]. Kisilewicz et al. [37] stated that data recorded by an IR camera should be collected for a sufficiently long period (an integer multiple of 24 hours) to determine the thermal resistance reliably and, avoid the fluctuations in temperature and heat flows. Carbonez et al. [59] considered that instantaneous IRT measurements only provided a single value in time and consequently, both the applicability and accuracy of the method were limited. Lucchi [55] pointed out that U-values obtained by IRT were often found to be a bit lower than those resulting from HFM. Each wall composition may need to be tested by specific NDT. Otherwise, a long-lasting test should be executed to provide more reliable results [55]. Generally, the usual approach for analysing IRT readings assumes that longer test duration leads to greater accuracy in the quantitative IRT method.

However, a thorough literature review has shown the use of different test durations and data acquisition intervals, which might also lead to a discrepancy in the assessment of in-situ U-values. The minimum test duration for the quantitative IRT method has been set at 2–3 hours under stationary conditions [36, 38, 62, 63, 54]. Regarding sampling frequency, a random criterion was detected for HFM and quantitative IRT [64]. Fokaides et al. [38] measured the surface temperature every 20 minutes for 3 hours and the U-value was the result of the average of the 10 measurements for each building element. Marinetti et al. [65] took 30 thermograms with a sampling interval of 10 seconds. Dall'O et al. [39] established a data acquisition interval of about 15 minutes, but only some sub-periods were suitable for the measurement. Lehmann et al. [29] selected a sequence of single thermograms taken at 5-minute intervals. Porras – Amores et al. [66] recorded images every 10 seconds and temperature readings every 1 second. De Freitas et al. [40] carried out 6 thermograms for each sunny day at different sampling intervals (3 h, 4 h, 1 h, 1 h and 5 h). Fox et al. [27] captured images every 20 to 30 minutes. Tejedor et al. [54] and Tejedor et al. [56] configured all the measuring equipment with a data acquisition interval of 1 minute, recording from 120 to 180 thermograms as the maximum. Bienvenido –Huertas et al. [64] proposed a sampling period of 15 minutes to facilitate the subsequent data analysis. Taking into account the aforementioned sampling durations and sampling frequencies, the usual approach adopted for this NDT could imply to manually post-process from 120 to 7200 thermograms with data acquisition intervals of 1 minute to 1 second respectively.

The number of thermograms has a direct impact on test execution. During the monitoring procedure, a sequential video is recorded. Such video is comprised of a number of frames or thermograms corresponding to the sampling frequency. In the processing stage, the instantaneous reading of the reflected ambient temperature ( $T_{REF}$ ) must be read and updated in the software by the technician, to obtain a reliable instantaneous reading of the wall surface temperature ( $T_{WALL}$ ) for each thermogram (Figure 1a). Otherwise, the IR camera software takes the  $T_{REF}$  that was measured at the beginning of the test by default for all images gathered during 2 to 3 hours of test duration, leading to no compensation of the errors for each instantaneous reading provided by the IR camera (Figure 1b). This is a significant issue, since the reflected ambient temperature might change throughout the IRT survey as the inner air temperature ( $T_{IN}$ ) increases in the same way that the reflection indexes of objects around the target may change.



(a) Manual processing stage of IRT measurements by the technician



(b) Processing stage of IRT measurements that software executes by default

Figure 1. Description of the analysis of thermograms for the quantitative IRT method

To resolve this lack of robustness of the method and avoid the human factor as an added source of discrepancy, an algorithm should be required during the thermographic survey. Nevertheless, a literature review did not reveal approaches to quantitative internal IRT in which the readings of in-situ tests in building envelopes were automated under a stationary regime. Algorithms have been developed to

process images under transient conditions for manufacturing processes and applying active IRT [67–72]. Montanini et al. [70] and D’Accardi et al. [72] enhanced the readability of images through a comparative analysis of data processing algorithms for detecting defects with active IRT: Pulsed Phase Thermography (PPT), Slope, Thermographic Signal Reconstruction (TSR), Guided Filtering (GF), Logarithmic Transformation (LN), Principal Component Analysis (PCT) and Correlation Coefficient ( $R^2$ ). The  $R^2$  was executed by IRTA Software [73], while the rest of the approaches were implemented using the MATLAB “Programming Environmental Toolbox” [74]. Mathematical processing methods play an important role in the effectiveness of IRT [71], since the assessment of IR maps takes a considerable amount of time [72]. In fact, future optimization of the processing parameters (i.e. number of evaluated frames) will be required to achieve better results in a minor time [72]. For this reason, quantitative IRT proposals should take into account the above aspects and probably work with signal modelling techniques.

In this context, the aim of the research was to critically evaluate the role of test duration and the feasibility of conducting short-lasting IRT tests in the determination of in-situ thermal transmittances of heavy multi-leaf walls from inside the building. Firstly, the measurements of six real façades under steady-state conditions were assessed to estimate the average U-value for several sampling durations. In this way, it was possible to check the assumption adopted by previous researchers, in which the NDT must be performed with long sampling durations to ensure higher accuracy. Secondly, monitored data were statistically evaluated as a stochastic process. In other words, quantitative IRT measurements were assumed as a U-value time series constituted by a constant signal plus random error. Subsequently, a second U-value time series analysis was computed through a signal modelling technique based on the MATLAB “System Identification Toolbox” [75]. Finally, considering the results of both studies, a routine for processing and stopping IRT tests is proposed. It should be noted that all case studies fall outside the scope of ISO 9869-2:2018 [49]. In addition, standardized methods (i.e. HFM) were not executed. Nardi et al. [76] and O’Grady et al. [77] stated that heavy walls show a low discrepancy (1.3 – 2.6%) between the measured U-values determined by HFM and IRT, in contrast to light walls (>47.6%).

The paper is structured as follows. Section 2 describes the research methodology used in this paper and the investigated building façades. Section 3 discusses the results and Section 4 exposes the main conclusions of this research.

## 2. METHODOLOGY

The research methodology was structured in three steps that are fully described in Sections 2.1. (The role of test duration on the accuracy of quantitative internal IRT measurements), 2.2. (U-value time series analysis using statistical tests) and 2.3. (U-value time series analysis by signal modelling technique).

### 2.1. The role of test duration on the accuracy of quantitative internal IRT measurements

As mentioned in the literature review, previous researches highlighted the use of a short test duration as a significant limitation of the quantitative IRT method. However, a random criterion for conducting the tests was detected. For this reason, the first part of this study was focused on analysing whether the deviation between theoretical and measured U-value ( $\Delta U/U_i$ ) decreased as sampling duration was longer, following the usual approach for quantitative thermography in which the input data of the numerical model is manually processed. The measurement campaigns were conducted on six typical Spanish heavy multi-leaf walls from January to March 2017, to ensure a correct implementation of this NDT in accordance with Tejedor et al. [54] (specifications of the developed method) and Tejedor et al. [56] (recommendations about influential operating conditions). The details of each investigated building envelope are given below, with information drawn from the construction documents (Figure 2; Table 1).

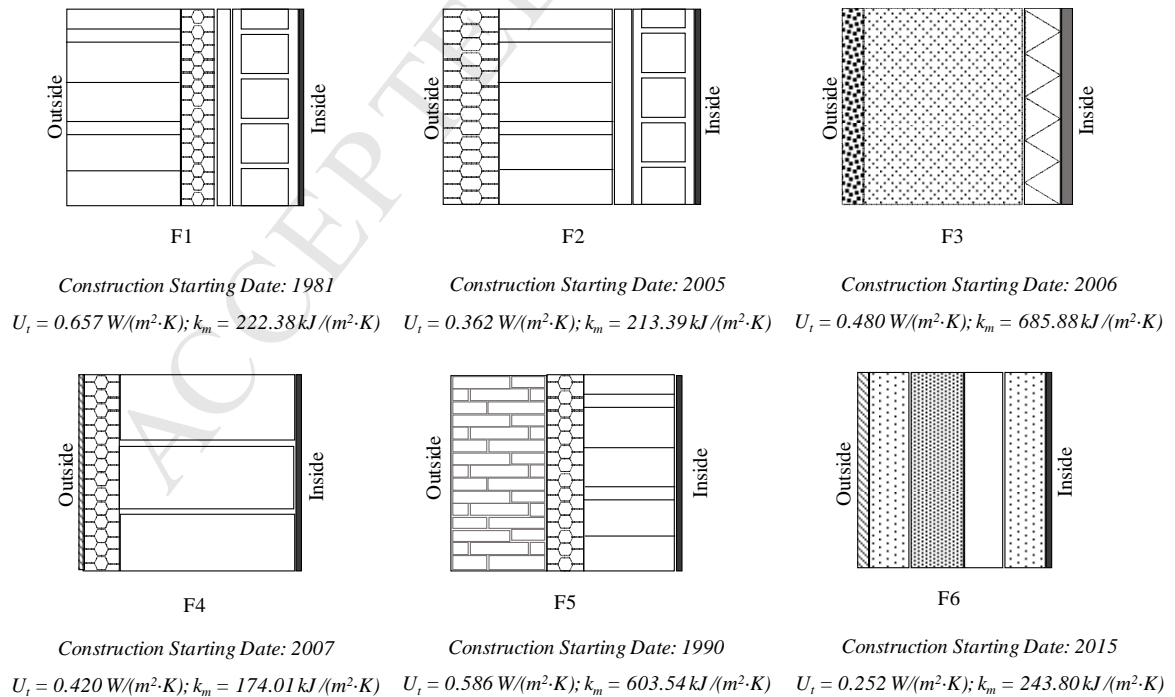


Figure 2. Schematic sections of the building envelopes and their construction starting date



Table 1. Configuration and technical features of the façades (from outside to inside)

N#	Material layer	$\Delta x_i$ [m]	$\lambda_i$ [W/(m·K)]	$\rho_i$ [kg/m <sup>3</sup> ]	$c_{p\ i}$ [J/(kg·K)]	$R_{t\ i}$ [(m <sup>2</sup> ·K)/W]	L [m]
F1	1 Perforated brick wall	0.140	---	1140	1000	0.180	2.50
	2 Insulation EPS	0.030	0.033	30	1400	0.909	
	3 Non-ventilated air cavity	0.020	---	1	1004	0.160	
	4 Hollow brick wall	0.050	---	1000	1000	0.070	
	5 Gypsum plaster	0.010	0.300	1150	1000	0.033	
F2	1 Insulation EPS	0.080	0.038	20	1400	2.125	2.70
	2 Perforated brick wall	0.140	---	1140	1000	0.180	
	3 Non-ventilated air cavity	0.050	---	1	1004	0.180	
	4 Hollow brick wall	0.040	---	1000	1000	0.090	
	5 Gypsum plaster	0.010	0.570	1150	1000	0.018	
F3	1 Limestone wall	0.030	2.300	2395	920	0.013	2.51
	2 Reinforced concrete wall	0.250	2.300	2400	1000	0.109	
	3 Rock wool insulation	0.064	0.037	40	840	1.730	
	4 Plasterboard	0.016	0.250	825	1000	0.064	
F4	1 Mortar	0.002	1.300	1900	1000	0.002	2.54
	2 Insulation EPS	0.060	---	20	1400	1.620	
	3 Thermoclay	0.240	---	910	719	0.570	
	4 Gypsum plaster	0.010	0.570	1150	100	0.018	
F5	1 Stone wall	0.180	2.200	2300	1000	---	2.45
	2 Insulation EPS	0.040	0.040	24	1340	---	
	3 Perforated brick wall	0.150	0.350	1140	1000	0.180	
	4 Gypsum plaster	0.015	0.570	1150	1000	0.018	
F6	1 Mortar	0.015	0.550	---	---	---	2.64
	2 Lightweight concrete	0.060	0.125	---	---	---	
	3 PIR insulation	0.080	0.028	---	---	---	
	4 Non-ventilated air cavity	0.060	---	---	---	0.180	
	5 Lightweight concrete	0.070	0.125	---	---	---	
	6 Gypsum plaster	0.015	0.430	---	---	---	

$\Delta x_i$ : thickness of the layer;  $\lambda_i$ : thermal conductivity of the layer;  $\rho_i$ : density of the layer;  $c_{p\ i}$ : specific heat capacity of the layer;  $R_{t\ i}$ :

notional thermal resistance of the layer; L: height of the wall

As shown in Figure 2, all the samples were from different construction periods. Façades F1, F2 and F5 were erected under the first thermal regulation that came into force (NBE-CT-79 [78]). The rest of the building envelopes were built under the current Spanish Technical Building Code (CTE-DB-HE1 [79]). The main technical features of each wall layer were taken from construction project documents and manufacturers' datasheets (Table 1). To determine the theoretical U-value, UNE-EN ISO 6946:2012 [80] and the Spanish Technical Building Code CTE-DB-HE1 [79] were applied. Finally, UNE-EN ISO 13786:2011 [81] and UNE-EN ISO 10456:2012 [82] were undertaken to calculate the heat capacity per unit of area.

Concerning the calculation procedure, few researchers have used quantitative internal IRT in their studies to determine the measured U-value [38, 33, 54, 56]. For its implementation in a real built environment, it can be considered that the building envelope is crossed by one-dimensional horizontal specific heat flux ( $q$ ) resulting from convection ( $q_c$ ) and radiation ( $q_r$ ) processes, without the impact of any sort of external thermal stimulus (i.e direct solar radiation) and under quasi steady-state conditions. According to the method proposed by the authors [54], the instantaneous measured thermal transmittance [ $\text{W}/\text{m}^2 \cdot \text{K}$ ] is expressed by Equation 1:

$$U_{mes_i} = \frac{\left( 0.825 + \frac{0.387 \cdot R_a^{\frac{1}{6}}}{1 + \left( \frac{0.492}{P_r} \right)^{\frac{9}{16}}} \right)^2 \cdot \lambda_{air}}{L} \cdot \frac{[T_{IN} - T_{WALL}] + \varepsilon_{WALL} \cdot \sigma \cdot [T_{REF}^4 - T_{WALL}^4]}{(T_{IN} - T_{OUT})} \quad (1)$$

Where  $\Delta T$  is the air temperature difference between inside and outside the building in [K], which involves the inner and outer air temperatures ( $T_{IN}$  and  $T_{OUT}$  respectively) in [K]. Other parameters in the equation are: wall surface temperature ( $T_{WALL}$ ) in [K]; reflected ambient temperature ( $T_{REF}$ ) in [K]; wall surface emissivity ( $\varepsilon_{WALL}$ ) with a value of 0.88 for gypsum plaster; Stefan–Boltzmann's constant ( $\sigma$ ) with a value of  $5.67 \times 10^{-8} [\text{W}/\text{m}^2 \cdot \text{K}^4]$ ; air thermal conductivity ( $\lambda_{air}$ ) measured in [ $\text{W}/\text{m} \cdot \text{K}$ ]; wall height ( $L$ ) seen from inside the building in [m]; and dimensionless parameters Rayleigh ( $R_a$ ) and Prandtl ( $P_r$ ) numbers for a laminar flow.

To measure and record the environmental parameters ( $T_{IN}$  and  $T_{OUT}$ ), two data loggers with type K thermocouples (TF-500, PCE –T390, PCE Iberica SL) were used. Their resolution and accuracy were set at 0.1°C and  $\pm 0.4\% +0.5^\circ\text{C}$ . To monitor the parameters related to the building envelope ( $\epsilon_{WALL}$ ,  $T_{REF}$  and  $T_{WALL}$ ), the following elements were installed: a reflector (crinkled aluminium foil as a substitute for Lambert's radiator with dimensions 0.20 x 0.15 m); a blackbody (taking as a reference a black tape with emissivity equal to 0.95 and dimensions 0.01 x 0.05 m); and an IR camera of long wavelength band (7-13  $\mu\text{m}$  of the spectral range). The thermal camera (FLIR60bx, FLIR SYSTEMS) had a field of view of 25x19°, an IR resolution of 320 x 240 pixels (thermal sensitivity  $<0.045^\circ\text{C}$  at  $30^\circ\text{C}$ ) and an accuracy of  $\pm 2^\circ\text{C}$  or 2% reading at ambient temperature (10 to  $35^\circ\text{C}$ ). Each thermogram was post-processed using the sequential video of 120 minutes provided by FLIR TOOLS + software [83].

Once instantaneous measured U-values had been calculated, the mean ( $U_{mes\ avg}$ ) was estimated from the total number of thermograms ( $n$ ) [Equation 2]:

$$U_{mes\ avg} = \frac{\sum_{i=1}^n (q_{ci} + q_{ri})}{\sum_{i=1}^n (T_{INi} - T_{OUTi})} = \frac{\sum_{i=1}^n U_{mes\ i}}{n} \quad (2)$$

## 2.2. U-value time series analysis using statistical tests

Theoretically, the instantaneous measured U-values ( $U_{mes\ i}$ ) should define a constant mean over time that would be known as  $U_{mes\ avg}$  or  $\bar{U}$  [ $\text{W}/(\text{m}^2 \cdot \text{K})$ ] and would be obtained at the end of an IRT survey from a specific number of thermograms ( $n$ ), as shown in Equation 2 of Section 2.1.

Nevertheless, it can be assumed that the quantitative internal IRT measurements describe a stochastic process of underlying data in practice, since a time series is a set of consecutive samples collected over a time interval and they are ubiquitous in any field that involves data monitoring [84, 85]. Moreover, time series can lead to an understanding of evolving processes or provide information about trends [85].

Figure 3 is shown to support the above assumption. The instantaneous measured U-values draw a constant signal as a function of time with a certain noise [ $e_k(t)$ ] that is characterized by random values with a constant mean and variance, normally and independently distributed, and uncorrelated (Equation 3). In accordance with Mahan et al. [85], this last aspect is known as “white noise”.

$$U(t) = \bar{U} + e_k(t) \quad (3)$$

Hence, the hypothesis of a stochastic process comprised of a constant signal plus white noise might be evaluated for a U-value time series with different test durations.

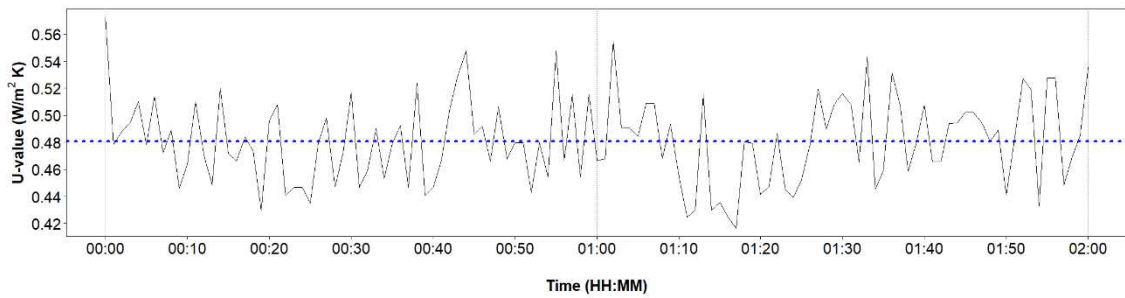


Figure 3. Example of a quantitative internal IRT test taken as a stochastic process

In accordance with the above statement, measurement noise  $[e_k(t)]$  might also be determined over time, assuming this parameter as the residuals if  $[U(t)]$  is modelled as a constant signal (Equation 4). To confirm that the measurement noise is fitted to white noise, the autocorrelation function (ACF) and the cumulated periodogram (CP) were used. Both had been used in previous studies in other fields that involved monitored data [86–89].

$$e_k(t) = \bar{U} - U(t) \quad (4)$$

The ACF measures the correlation between observations at different times [90]. When a process is non-stationary, it does not tail away to zero quickly or cut-off after a finite number of steps [85]. Hence, the ACF of the signal should not contain more statistically significant terms than the number expected by chance. This depends on the number of lags or delays [85], which is one time unit for the first-order autocorrelation [90].

The CP is the vector of partial sums of the periodogram, normalized by the sum of all elements. Since the Fourier transform of the residuals is obtained by a linear transformation with an orthogonal matrix, the real and imaginary parts of the transform model would still be distributed independently and normally [91]. The test is focused on constructing two lines parallel to the one above and passing through the  $\pm 5\%$

point of the Kolmogorov-Smirnov statistics. These lines define a 95% confidence interval for white noise [92, 91].

In both statistical tests, the analysis was computed for 120, 60 and 30 minutes of test duration. These data points coincide with the number of thermograms that were post-processed, since the data acquisition interval was 1 minute. The limitation related to minimum data points was supported as follows. Roughly speaking, a sample size of at least 40–100 repeat observations was recommended. Otherwise, due to sampling error, the estimated functions might not contain enough information for a meaningful identification [93–97]. However, statisticians and researchers adopted a general criterion based on the central limit theorem (CLT) in which the sample size should be  $N \geq 30$  in practice, to assume the distribution of sample mean approximated to the normal distribution [98, 99]. The shapes of probability distributions may vary for  $N \leq 30$  [99].

Finally, to determine the variability among the instantaneous U-values of each time series for all investigated buildings, the following parameters were calculated: the mean ( $\bar{U}$ ), the standard deviation (SD or  $\sigma$ ), and the coefficient of variation (CV). Subsequently, the 95% confidence intervals were also statistically estimated to observe whether the readings of each time series were equal. In other words, the aim was to evaluate whether there was a relevant difference among average measured U-values resulting from 120, 60 and 30 minutes. The following expression (Equation 5) was applied to calculate the 95% confidence intervals (CI), considering that  $n$  is the specific number of thermograms or data points to be analysed:

$$CI(95\%) = \bar{U} \pm 1.96 \cdot \frac{\sigma}{\sqrt{n}} \quad (5)$$

### 2.3. U-value time series analysis by signal modelling technique

Wiener [100] and Brown et al. [101] carried out several studies about extrapolation, interpolation or smoothing of stationary and transient time series for engineering applications. Later, some authors compared inverse heat conduction problems (IHCP) using experimental data to determine thermal properties of materials [102–106]. Le Niliot et al. [104] combined thermographic measurements with numerical techniques to identify unknown heat line sources and boundary conditions for the transient

diffusion problem. Ilyinsky et al. [103] and Rainieri et al. [105] determined the local distribution of the heat transfer coefficient in thermal systems by applying a filtering technique to remove the undesired noise assumed as random uncertainties in temperature measurements. Their methods were based on the Fourier Transform technique to estimate the heat source distribution in a square domain, taking the surface map recorded by an IR camera as a starting point. Rainieri et al. [105] applied this type of analysis to compact heat exchangers. They concluded that the Wiener filter might be more efficient than other traditional filtering procedures, using the MATLAB “Signal Processing Toolbox” and “Image Processing Toolbox” [107, 108]. Jiménez et al. [109] applied the MATLAB “IDENT Toolbox” [110] to calculate the thermal properties of building elements for tests undertaken from outside the building under transient conditions. In that study, they stated that the RC-network can be formulated as ARMAX or ARX models by means of MATLAB. In addition, only ARX models could simplify the analysis without loss of generality. If the predictions were correctly calculated, then the one-step prediction error or residual could be considered as white noise sequence [109]. Notably, the ARX (autoregressive model with external input) is known as one of the simplest parametric structures, while the ARMAX (autoregressive moving average model with external input) is interesting and useful when dominating disturbances appear early in the process [111].

To support the results obtained in the first U-value time series analysis (Section 2.2), an alternative recognized method must be applied. Taking into account the aspects mentioned above, the MATLAB “System Identification Toolbox” [75] was chosen for this study. Firstly, operation pre-processes of the signal (i.e. filters) and several models (such as ARX and ARMAX) were developed, with the IRT data introduced into the MATLAB “System Identification Toolbox” [75]. Secondly, to detect whether the results provided by reduced order models were correct, the following aspects were checked: the stability of the model, the resonance state in the frequency response plot, the distribution of zeros and poles, the ACF of the residuals at 95% confidence level. Thirdly, the modelled signals, the instantaneous measured U-values and the theoretical U-values were plotted against time for each building envelope. In this way, MATLAB allowed observing whether the system was under steady-state conditions for sampling durations < 120 minutes and if the hypothesis adopted in Section 2.2. was also fulfilled.

### 3. DISCUSSION OF RESULTS

#### 3.1. The role of test duration on the accuracy of quantitative internal IRT measurements

This section pretends to discuss if longer test durations entail significant accuracy differences among data packages. The measured U-values of each wall and their respective deviations with the theoretical thermal transmittance ( $\Delta U/U_t$ ) were determined for 2 hours of sampling duration and a data acquisition interval of 1 minute, following the process extensively reported in Tejedor et al. [54] and refined in Tejedor et al. [56] through the analysis of the most influential operating conditions. Subsequently, the deviations between theoretical and measured U-value were plotted against time (120, 60, 30 and 15 minutes).

As can be observed in Figure 4, the optimum deviations between theoretical and measured U-values (indicated with a red circle) fluctuated over time. The lowest gap was obtained by F3 and F4 after only 30 minutes of the test, since  $\Delta U/U_t$  were found to be 0% and 1.19% respectively. F1 and F5 presented a deviation of 0.46% and 3.41% after 60 minutes of the test. The best results for F2 and F6 were gathered at 120 minutes, with an error of 9.39% and 1.98% respectively. Therefore, it seems that long-lasting tests do not always ensure more accurate outcomes, since only 2 case studies led to obtain lower errors with longer measurements (120'). Consequently, it seems that the usual approach for establishing test duration might not be considered to standardize this NDT.

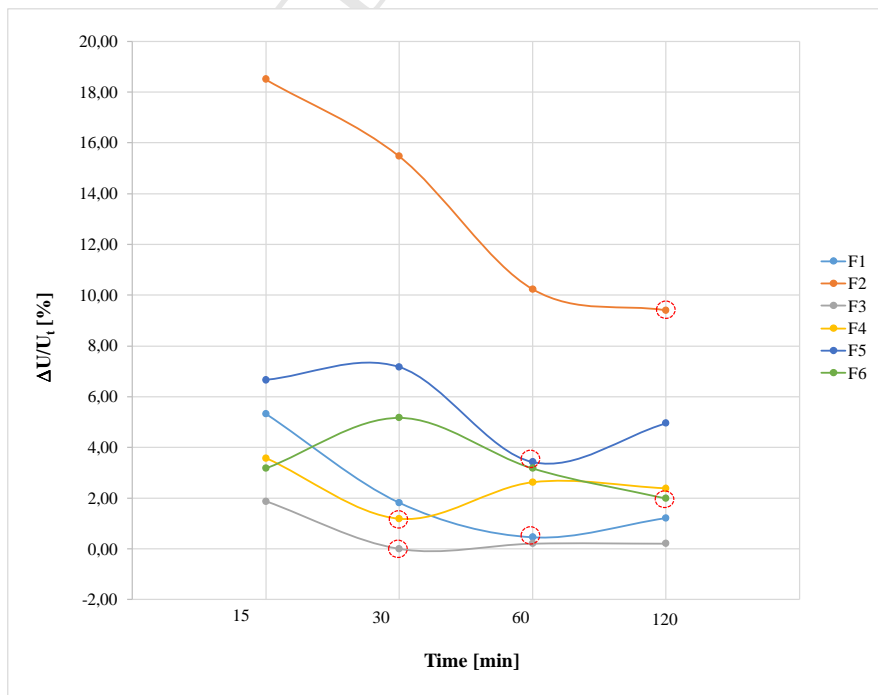


Figure 4. Deviation of the measured U-values over time

Some boundary conditions were given during the execution of this NDT:

- The wind speed was found to be lower than 0.5 m/s for all case studies, avoiding the thermal dispersion of convective factors around the external wall surface. According to Albatici et al. [36] and Dall'O et al. [39], the accuracy of this NDT could be affected by the wind speed, especially in walls with low thermal mass since they cool down faster. Nevertheless, and considering that the current research was performed on heavy multi-leaf walls ( $k_m > 150 \text{ kJ/m}^2 \cdot \text{K}$ ), the impact of wind speed was negligible.
- The measurements were conducted on northern façades in the early morning, avoiding the direct solar radiation. Otherwise, the influence of this external thermal stimulus might not have been easily predictable and consequently, the IRT survey would have been performed on dynamic heat transfer conditions. Neither indoor sides of the buildings were exposed to direct sunlight through adjacent windows.
- In previous studies, Tejedor et al. [54] and Tejedor et al. [56] demonstrated that the optimum schedule was from 6 a.m. to 9 a.m. during the winter. Outside temperatures ranged from 0 to 5°, resulting the period of day with minimum fluctuations.
- Façades F1 to F4 belonged to unoccupied residential buildings that had neither electric nor heating sources. In fact, they had not been occupied for years (F1) or they had not been in-use since their construction stage (F2, F3, F4). These aspects lead to perform quantitative IRT inspections under an inner air temperature of 12-14°C and within the optimum temperature difference range set by Tejedor et al. [56].
- Façades F5 and F6 presented a heating system in operation. F5 was a residential building that had only been used in certain seasonal periods of the year (summer or winter). The control of the heating system was centralized and the thermographer could not modify the inner temperature set point. For this reason, the test was performed for  $18.30 < \Delta T < 19.60^\circ\text{C}$ . F6 was a new building mock-up in real scale based on prefabricated panels with structural and insulation functions as well as incorporated facilities to be configured by the user or thermographer.
- The thermal conductivity of the air ( $\lambda_{air}$ ) was assumed to be 0.024 W/m·K for the unoccupied buildings that formed part of public housing stock (F1 to F4) and their electric or heating systems were not switched on ( $T_{IN}=0\text{-}15^\circ\text{C}$ ). For buildings with a heating system in operation (F5 and F6), this parameter was set at 0.025 W/m·K ( $T_{IN}=15\text{-}25^\circ\text{C}$ ) [56].



- Considering laminar flux, the dimensionless parameters Rayleigh ( $R_a$ ) and Prandtl ( $P_r$ ) numbers should be determined. The Prandtl ( $P_r$ ) number was assumed to be 0.73 for  $T_{IN}=0-25^\circ\text{C}$ . However, the Rayleigh number (Equation 6) should be calculated in accordance with Tejedor et al. [56], since it mainly depends on the inner air temperature ( $T_{IN}$ ) and the wall surface temperature ( $T_{WALL}$ ):

$$R_a = G_r \cdot P_r = \frac{g \cdot \beta \cdot (T_{IN} - T_{WALL}) \cdot L^3}{\nu^2} \cdot P_r \quad (6)$$

Where  $G_r$  is the Grashof number;  $g$  refers to gravitation ( $9.8 \text{ m/s}^2$ );  $\beta$  is the volumetric temperature expansion coefficient [ $1/\text{K}$ ] that is defined by  $\beta=1/T_m$ , where  $T_m = (T_{IN} + T_{WALL})/2$ ;  $\nu$  is the air viscosity with a value of  $1.4 \cdot 10^{-5} \text{ m}^2/\text{s}$  for  $T_{IN}=0-15^\circ\text{C}$  and  $1.5 \cdot 10^{-5} \text{ m}^2/\text{s}$  for  $T_{IN}=15-25^\circ\text{C}$ .

The formulation and tabulated values of the thermal conductivity of the air, the Prandtl and Rayleigh numbers and the air viscosity were taken from several sources [112–116], including the values provided by EES Software [117].

### 3.2. U-value time series analysis using statistical tests

Roughly speaking, the first U-value time series analysis reported in Section 2.2. might provide enough statistical information to detect whether the IRT signal draws cycles. This could indicate that the quantitative internal IRT test is being executed under a transitory regime or more observations are required with a data acquisition interval of 1 minute to achieve reliable U-values.

An in-depth analysis of the residuals of the measured data for each building façade as well as their respective ACF and CP is reported in Figures 5–10. At the end of this section, the key features are summarized, and supported by Tables 2–3 and Figure 11. Table 2 shows the main parameters to evaluate the variability among instantaneous U-values ( $\bar{U}$ ,  $\sigma$ , CV). It highlights whether the hypothesis of constant signal plus white noise could be adopted for all heavy walls. Table 3 compares the mean, standard deviation and coefficient of variation between packages of sampling duration (120 vs. 60 minutes; 60 vs. 30 minutes; 120 vs. 30 minutes). In this way, it is possible to quantify the variability degree. Figure 11, which is a graphical representation of 95% confidence interval (CI) for U-value estimations, allows observing if the measurement errors could be accepted or tolerated in order to reduce the test duration.

Façade F1 was characterized by an average thermal transmittance of  $0.665 \text{ W/m}^2\cdot\text{K}$  for 120 minutes,  $0.654 \text{ W/m}^2\cdot\text{K}$  for 60 minutes and  $0.645 \text{ W/m}^2\cdot\text{K}$  for 30 minutes (Table 2). The left graphs of Figure 5 plot the noise  $[e_k(t)]$  of in-situ measured U-values as a function of time. Discontinuous black lines represent the average value, that is 0, and discontinuous blue lines represent  $\pm\sigma$ . The  $e_k$  values reached peaks of between  $0\pm0.08 \text{ W/m}^2\cdot\text{K}$  and  $0\pm0.12 \text{ W/m}^2\cdot\text{K}$ . From the above aspects, it can be stated that the IRT tests were reliable. In accordance with Table 3, the deviation of the results was low with respect to the average value obtained from the three times series ( $\bar{U}=0.654 \text{ W/m}^2\cdot\text{K}$ ).

As seen in Figure 5, the results of the ACF revealed that some lags fell outside the 95 % confidence interval (2 for 120 minutes, 3 for 60 minutes and 1 for 30 minutes). Nevertheless, these lags did not exceed the expected values (the 5% of the total lags for each test duration). Moreover, no cycles or trends were observed in the three-time series. Only one peak in CP was detected, but it was of minor importance. Hence, it can be affirmed that the measurements can be regarded as a constant signal plus white noise.

An analysis of the graphical representation of 95% confidence intervals (Table 2; Figure 11), revealed that there was no significant difference among the measured U-values for the three test durations. The other statistical parameters related to the variability of the measurements indicated a similar dispersion (Figure 11; Tables 2–3). The standard deviations were found to be between  $0.047 \text{ W/m}^2\cdot\text{K}$  and  $0.052 \text{ W/m}^2\cdot\text{K}$ . The coefficients of variation (CV) ranged from 7.08 % to 8.13 %. In accordance with the aspects described above, the in-situ thermal transmittances of F1 could have been determined after the first 30 minutes of test duration.

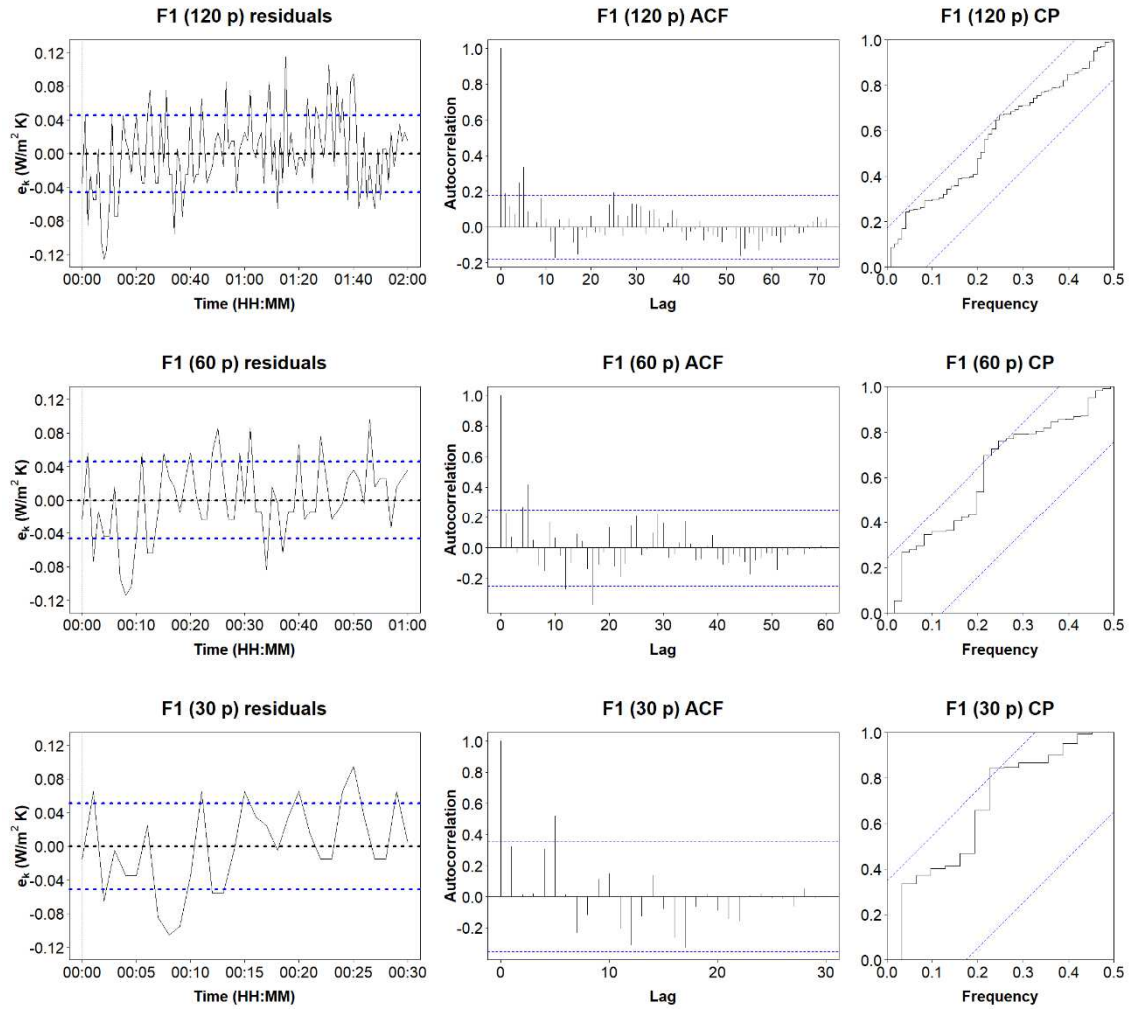


Figure 5. The left column shows the residuals of the measured data for F1. The middle column presents the ACF plot for F1. The right column indicates the CP for F1

Most residuals of the quantitative internal IRT measurements of F2 were found to be reliable for the three sampling durations. The average measured U-value of F2 was  $0.404 \pm 0.053$  W/m<sup>2</sup>·K (Table 3) and the partial data were: 0.396 W/m<sup>2</sup>·K for 120 minutes, 0.399 W/m<sup>2</sup>·K for 60 minutes and 0.418 W/m<sup>2</sup>·K for 30 minutes (Table 2). Hence, the IRT tests can be deemed acceptable. However, the difference between the partial average measured thermal transmittances for 120 and 60 minutes was only 0.003 W/m<sup>2</sup>·K, whereas  $|\bar{U}_{120} - \bar{U}_{30}|$  increased to 0.022 W/m<sup>2</sup>·K (Table 3). Indeed, and considering all façades, this last value was noted as the highest.

The ACFs did not have a peak and the CPs provided similar information (Figure 6). The values were fitted to the top confidence interval band. Considering the aspects mentioned above, the quantitative

internal IRT measurements of F2 could be accepted as a constant signal plus white noise and a constant sigma independent from the test duration for heavy multi-leaf walls with a low U-value.

An analysis of the variability of measurements obtained for this building envelope (Tables 2-3) indicates that this façade wall had worse standard deviation ( $\sigma=0.050\text{--}0.056\text{ W/m}^2\cdot\text{K}$ ) and coefficient of variation ( $12.70\% < CV < 13.97\%$ ) values than the other investigated samples. There was substantially more variation for the test with 30 data points, as indicated in Figure 11 and Table 3. However, the outcomes of the three test durations might be accepted as valid.

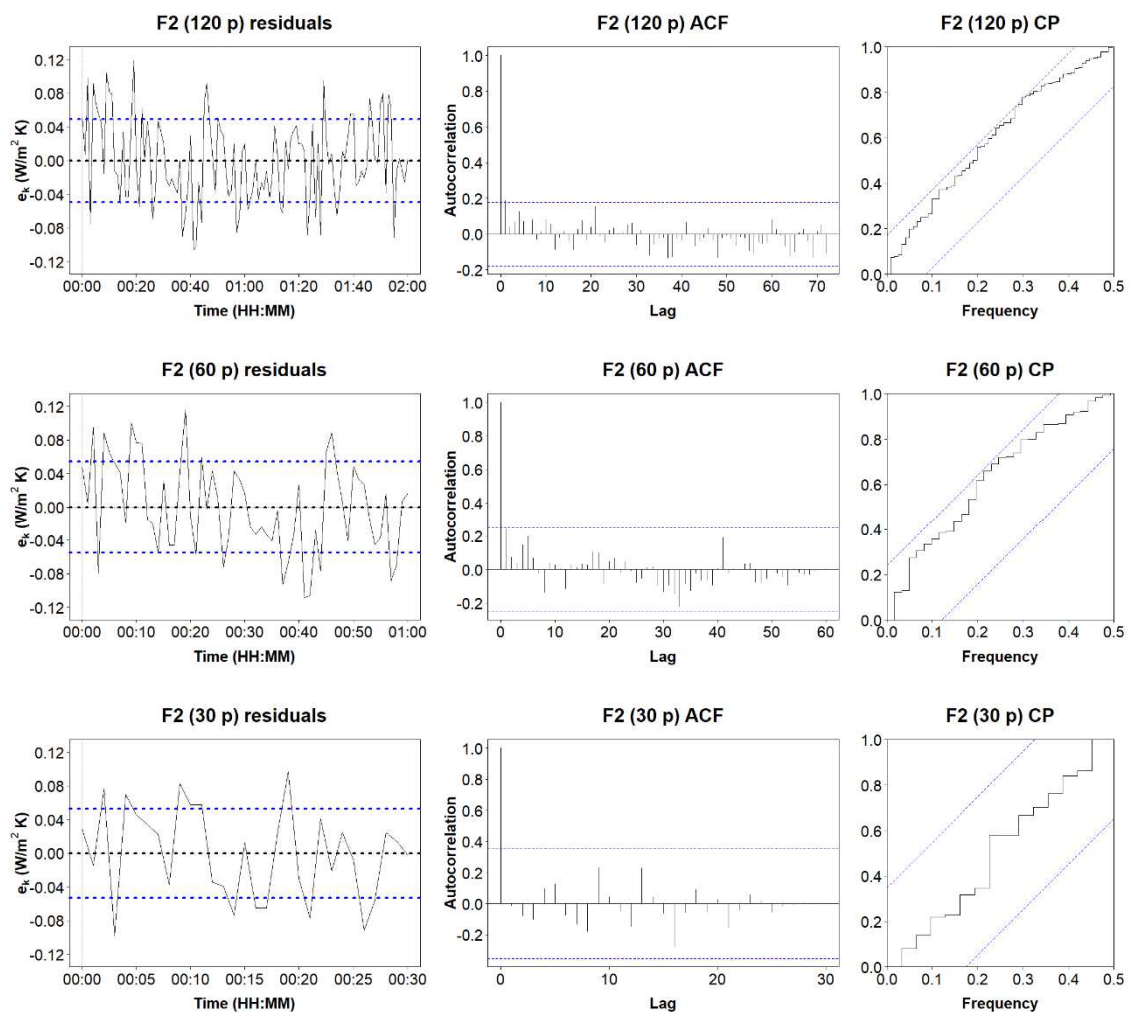


Figure 6. The left column shows the residuals of the measured data for F2. The middle column presents the ACF plot for F2. The right column indicates the CP for F2

The best results were gathered for F3, since the data collected for this building envelope showed extremely similar signals (Table 2):  $0.481 \pm 0.032 \text{ W/m}^2 \cdot \text{K}$  for 120 minutes;  $0.481 \pm 0.030 \text{ W/m}^2 \cdot \text{K}$  for 60 minutes; and  $0.480 \pm 0.031 \text{ W/m}^2 \cdot \text{K}$  for 30 minutes. The deviations among the results were minimal (Table 3) and only four residual peaks presented a value over  $e_k = 0 + 0.06 \text{ W/m}^2 \cdot \text{K}$  (Figure 7).

The above aspects were corroborated with the time series analysis. No significant term was detected in the ACF plots (Figure 7; the middle column). In addition, the CPs of F3 (Figure 7; the right column) were slightly better than the rest of the investigated buildings (the signal described almost a straight line in the middle of the space defined by the two lines of the 95% confidence level band). Hence, it can be affirmed that U-value measurements could be considered a signal with a constant mean plus white noise for each test duration.

Regarding variability (Table 2), the CV was found to be between 6.34% and 6.67%. Therefore, the difference of variability in instantaneous readings was set at 0.24% (Table 3). The standard deviation showed the same value ( $\sigma \sim 0.030 \text{ W/m}^2 \cdot \text{K}$ ), regardless of the sampling duration to be validated. These aspects were supported by the graphical representation of the 95% confidence intervals (Figure 5), which were practically the same size. In other words, the same degree of dispersion and skewness was produced in all data. Considering the above aspects, the first 30 minutes of the test might be enough to process the IRT measurements and calculate the thermal transmittance of F3.

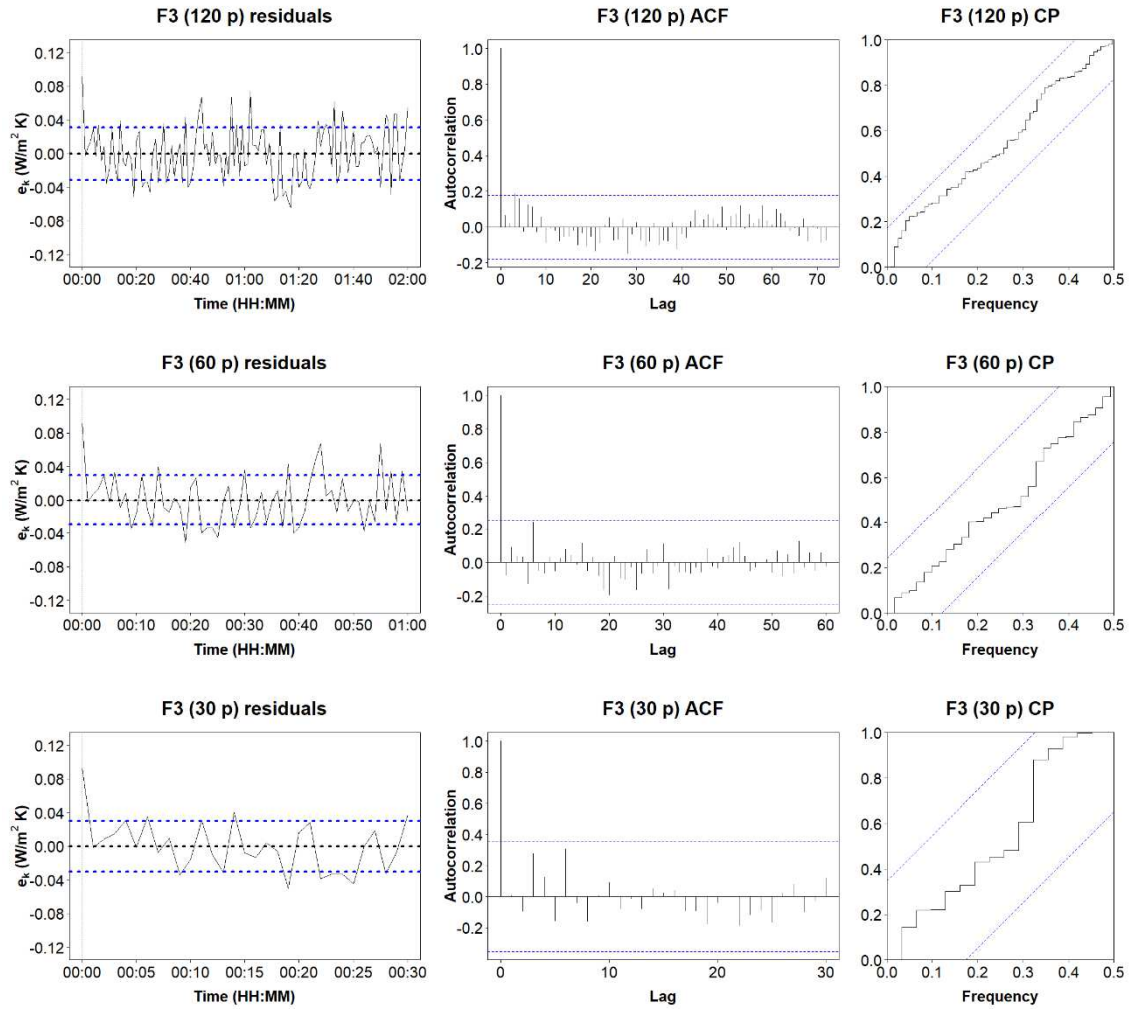


Figure 7. The left column shows the residuals of the measured data for F3. The middle column presents the ACF plot for F3. The right column indicates the CP for F3

In the representation of residuals of the U-values for F4 as a function of time (Figure 8), some peaks were distinguished outside of the range  $[0 \pm \sigma]$ . However, they remained under  $e_k = 0 \pm 0.06$  W/m<sup>2</sup>·K. The partially measured U-values were:  $0.430 \pm 0.031$  W/m<sup>2</sup>·K for 120 minutes,  $0.431 \pm 0.033$  W/m<sup>2</sup>·K for 60 minutes, and  $0.425 \pm 0.034$  W/m<sup>2</sup>·K for 30 minutes (Tables 2–3).

To evaluate in-depth whether the outcomes of this building envelope might be considered reliable, the results needed to be compared with the time series analysis and the study of data variability. In the ACF plot, one significant term was noted for all test durations (Figure 8). In fact, a slight cyclical trend might be described for 60 lags in the graph, but the signals obtained for 120 minutes and 30 minutes discarded this aspect. Practically all readings were inside the 95% confidence interval band, as seen in the CP.



These aspects reveal that the hypothesis of a signal with constant mean plus white noise can be adopted for quantitative IRT measurements. An analysis of variability of the results (Figure 11; Tables 2-3) presented similar standard deviations for all signals ( $\sigma=0.031\text{--}0.034\text{ W/m}^2\cdot\text{K}$ ) and coefficients of variation ( $7.25\% < CV < 8.12\%$ ).

In the graphical representation of the 95% confidence intervals for the U-value estimations (Figure 11), the dispersion of data were slightly higher for the test that took 30 minutes. Overall, the results revealed that the procedure for all tests was correct and the first 30 minutes of the IRT test could be adopted to process the images recorded for F4.

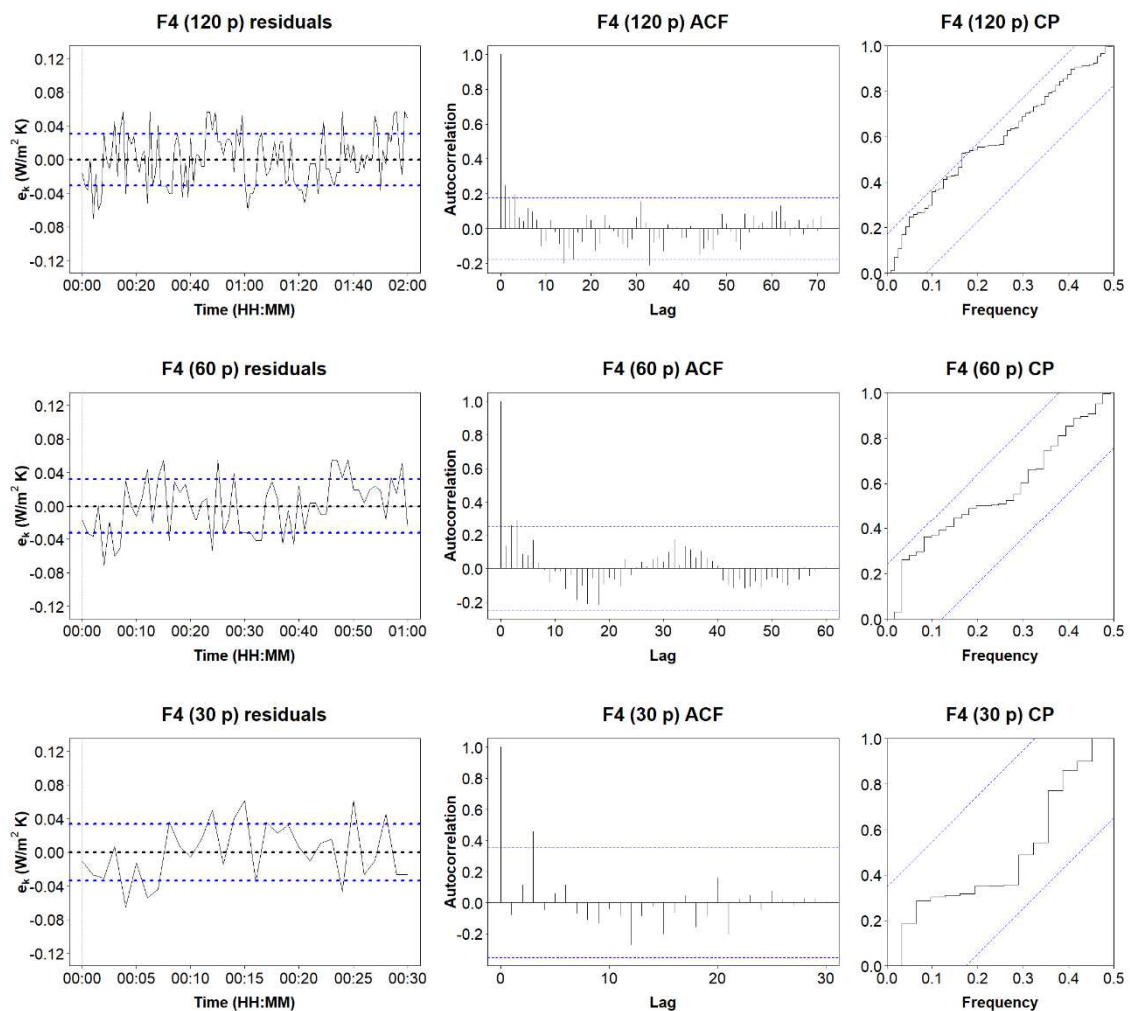


Figure 8. The left column shows the residuals of the measured data for F4. The middle column presents the ACF plot for F4. The right column indicates the CP for F4

Most residuals of U-values for F5 plotted against time were found to be far closer to sigma over the tests. The intervals of the U-value measurements were:  $0.557 \pm 0.028$  W/m<sup>2</sup>·K for 120 minutes;  $0.566 \pm 0.028$  W/m<sup>2</sup>·K for 60 minutes;  $0.554 \pm 0.031$  W/m<sup>2</sup>·K for 30 minutes (Tables 2-3). The statistical parameters were all inside the acceptable range (Table 2), but the data points did not tail away to zero very quickly at the beginning of the tests, especially when the test duration was set at 120 minutes (ACF, Figure 9). Nine significant terms were detected. The residuals of measured U-values fell slightly outside the top band of the 95% confidence interval (CP, Figure 9). The behavior of the signals over time was better for 60 or 30 minutes.

From the analysis of variability (Table 2 and Figure 11), it can be extrapolated that façade F5 had the lowest CV, reaching values between 4.97% and 5.68%. This means that the dispersion of the probability distribution was low. Notably, the difference between the minimum and maximum values of this last statistical parameter was found to be 0.71% (Table 3). The standard deviations were found to be 0.028 W/m<sup>2</sup>·K for 120 and 60 minutes and 0.031 W/m<sup>2</sup>·K for 30 minutes. These facts support the statement that the analysis of thermographic images might be reduced to the first 30 minutes of test duration, as also shown in the graphical representation of 95 % confidence intervals (Figure 11).



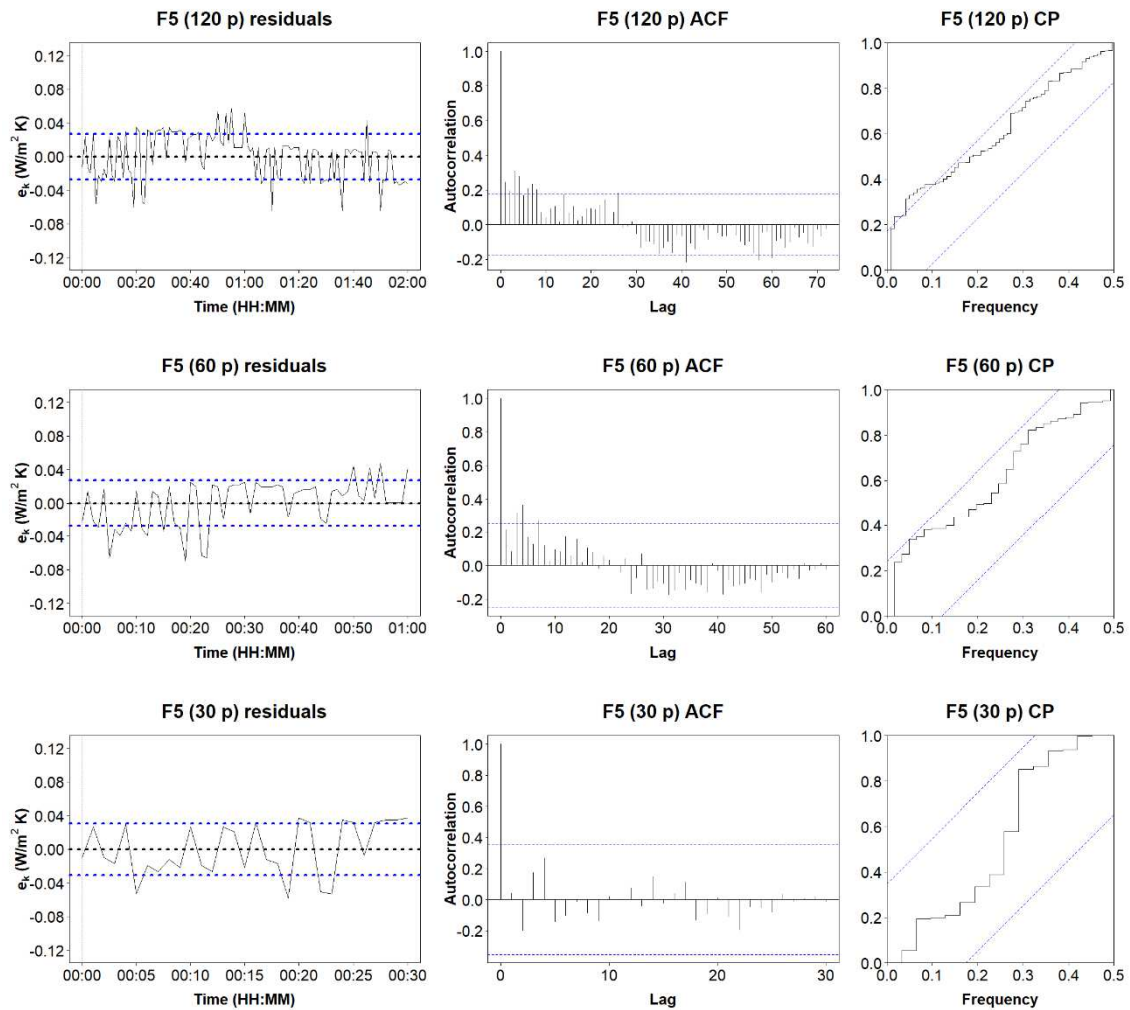


Figure 9. The left column shows the residuals of the measured data for F5. The middle column presents the ACF plot for F5. The right column indicates the CP for F5

In the graphical representation of the residuals of U-values for F6 in function of time (Figure 10), most of the data points showed minor  $e_k$  values throughout the tests in comparison with other façades. The average thermal transmittance values were 0.257 W/m<sup>2</sup>·K for 120 minutes, 0.260 W/m<sup>2</sup>·K for 60 minutes and 0.265 W/m<sup>2</sup>·K for 30 minutes (Tables 2-3).

According to Figure 10, some peaks of minor importance were observed in both ACF and CP for 120 points. As seen, measurements could be regarded as a constant mean plus white noise and this façade presented stationarity throughout the tests. In contrast with other heavy multi-leaf walls, some aspects related to the analysis of variability can be highlighted (Tables 2–3). F6 had the lowest values of standard deviation, reaching a maximum value of 0.019 W/m<sup>2</sup>·K. The CVs were around 7% like other evaluated

samples, but the variation among partial data was extremely low (0.02 % -Table 3-). Indeed, the results for both statistical parameters were expected, since F6 showed minor residual values ( $e_k$ ) throughout the tests in comparison with other façades (Figure 10). Considering these aspects, it can be assumed that all the time series defined a signal with constant mean plus white noise and the hypothesis of stationarity can be fulfilled.

Concerning the graphical representation of the 95% confidence intervals (Figure 11), the outcomes showed a downward trend of the average measured U-value and its confidence intervals were far smaller for a longer sampling duration. Therefore, only the first 30 minutes of the test might be required to determine the in-situ measured U-value.

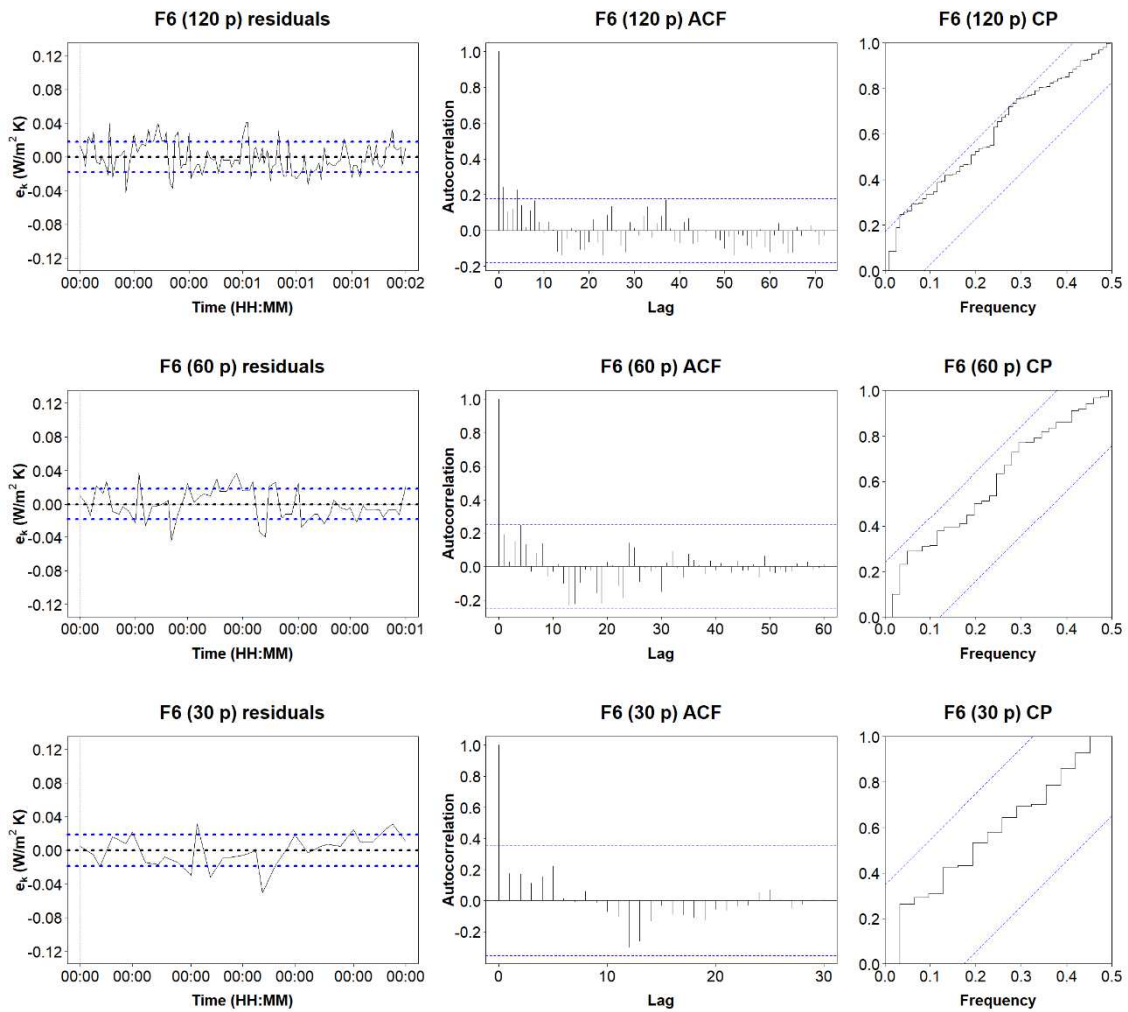


Figure 10. The left column shows the residuals of the measured data for F6. The middle column presents the ACF plot for F6. The right column indicates the CP for F6

Overall, it can be concluded that all statistical results reported reasonable values. Hence, it can be stated that the first 30 minutes of the test might be enough to determine in-situ measured U-values. The proposed hypothesis for the U-values time series analysis was fulfilled for all investigated samples, to obtain a signal with a constant mean plus white noise. This aspect was in line with the results of the ACF and CP plots, where some lags fell outside the 95% confidence interval but were less than 5% (Figures 5–10).

The graphical representation of the 95% confidence intervals of all investigated façades suggested that the variability in the measurements did not differ significantly among the three selected sampling durations (Table 2–3; Figure 11). In fact, confidence intervals were extremely similar among samples (i.e. F1 and F2; F3 to F6) and were slightly greater for 30 points. This last aspect was expected due to a reduction in the sample size for the time series. In other words, the confidence interval is defined as  $CI = f(\bar{U}, \sigma, n)$  in accordance with Section 2.2. If the mean and sigma remained practically constant among tests, the only parameter that entailed an increase or decrease in CI length was the number of thermograms to be analysed. Moreover, the comparative analysis among sigma values gathered for each time series (Table 3) showed that the differences ranged around zero, reaching  $0.005 \text{ W/m}^2\cdot\text{K}$  as a maximum. The CVs were also low (from 4.97 to 8.13% for façades F1, F3–F6), except façade F2 (12.70 to 13.97%). As seen in Table 3, the differences in CVs among time series were found to be under 1% in most cases. A thorough literature review showed that quantitative internal IRT did not have a limit for the CV. Nevertheless, the results of this research were consistent with previous studies on other techniques, such as the standardized HFM method [9, 11, 118, 45, 12, 13, 32, 15, 119]. Considering all the aspects mentioned above, it could be stated that a longer test duration would not lead to an improvement in results.

Table 2. Summary of results. Average measured U-values ( $\bar{U}$ ), standard deviation ( $\sigma$ ), coefficient of variation (CV) and validation of the hypothesis of a constant signal plus white noise

	$\Delta T$ [°C]	Time [min]	$\bar{U}$ [W/m <sup>2</sup> ·K]	$\sigma$ [W/m <sup>2</sup> ·K]	CV [%]	Hypothesis
<b>F1</b>	6.80 < $\Delta T$ < 8.70	120	0.665	0.047	7.08	Fulfilled
		60	0.654	0.047	7.29	Fulfilled
		30	0.645	0.052	8.13	Fulfilled
<b>F2</b>	7.60 < $\Delta T$ < 9.10	120	0.396	0.050	12.70	Fulfilled
		60	0.399	0.056	13.97	Fulfilled
		30	0.418	0.054	12.99	Fulfilled
<b>F3</b>	5.80 < $\Delta T$ < 8.20	120	0.481	0.032	6.67	Fulfilled
		60	0.481	0.030	6.34	Fulfilled
		30	0.480	0.031	6.42	Fulfilled
<b>F4</b>	8.70 < $\Delta T$ < 9.60	120	0.430	0.031	7.25	Fulfilled
		60	0.431	0.033	7.69	Fulfilled
		30	0.425	0.034	8.12	Fulfilled
<b>F5</b>	18.30 < $\Delta T$ < 19.60	120	0.557	0.028	4.97	Fulfilled
		60	0.566	0.028	5.02	Fulfilled
		30	0.554	0.031	5.68	Fulfilled
<b>F6</b>	8.20 < $\Delta T$ < 10.40	120	0.257	0.018	7.16	Fulfilled
		60	0.260	0.019	7.32	Fulfilled
		30	0.265	0.019	7.18	Fulfilled

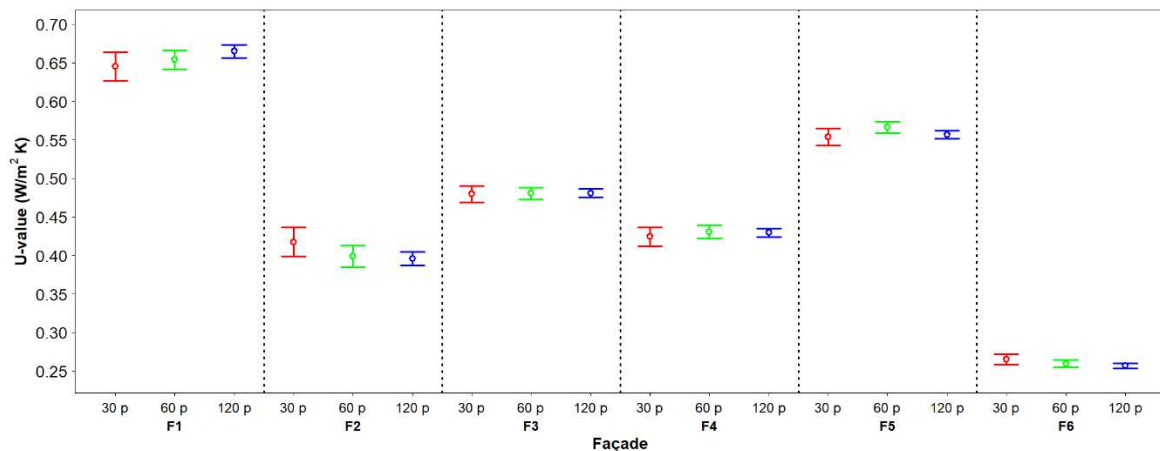


Figure 11. Graphical representation of 95% confidence intervals for U-value estimations

Table 3. Estimation of variability

	F1	F2	F3	F4	F5	F6
<b>Estimation <math>\bar{U}</math> [W/m<sup>2</sup>·K]</b>	0.654	0.404	0.480	0.428	0.559	0.261
$ \bar{U}_{120} - \bar{U}_{60} $	0.011	0.003	0.000	0.001	0.010	0.003
$ \bar{U}_{60} - \bar{U}_{30} $	0.009	0.019	0.001	0.006	0.012	0.006
$ \bar{U}_{120} - \bar{U}_{30} $	0.020	0.022	0.001	0.005	0.003	0.008
<b>Estimation <math>\sigma</math> [W/m<sup>2</sup>·K]</b>	0.049	0.053	0.031	0.033	0.029	0.019
$ \sigma_{120} - \sigma_{60} $	0.000	0.005	0.002	0.002	0.001	0.001
$ \sigma_{60} - \sigma_{30} $	0.005	0.001	0.000	0.001	0.003	0.000
$ \sigma_{120} - \sigma_{30} $	0.005	0.004	0.001	0.003	0.004	0.001
<b>Estimation coefficient of variation [%]</b>	7.49	13.22	6.48	7.69	5.22	7.22
$ CV_{120} - CV_{60} $	0.18	1.27	0.33	0.43	0.04	0.16
$ CV_{60} - CV_{30} $	0.87	0.97	0.09	0.43	0.66	0.13
$ CV_{120} - CV_{30} $	1.05	0.29	0.24	0.87	0.70	0.02

### 3.3. U-value time series analysis by signal modelling technique

As mentioned above (Section 2.3), a second U-value time series analysis was conducted in this study using the MATLAB “System Identification Toolbox” [75] to support the results obtained by the first U-value time series analysis through statistical tests (Section 3.2). The MATLAB are detailed below.

The results revealed that the models with the best adjustment for the reference signal were ARX or ARMX. The model was stable for all heavy multi-leaf walls if it was constituted by a simple structure ( $na=1$ ,  $nb=4$ ,  $nk=7$ ). According to Jiménez et al. [109],  $na$  denotes the order of polynomial  $A(q)$ ,  $nb$  the order of polynomial  $B(q)$ , and  $nk$  the delay between output and input. In this thesis, the analysis was limited to models with  $na$ ,  $nb$  and  $nk$ , varying between 1 and 10. By way of example, the results of façade F3 are presented. Figure 12 shows the typical model structure for this building envelope. The models indicated as “Best Fit” (red) by the “System Identification Tool” were those characterized by  $na=10$ ,  $nb=10$  and  $nk=8$ . Nevertheless, the MDL Choice (green) was enough for this study, since the biggest change in the model misfit was generated at the beginning and provided less complexity in the execution.

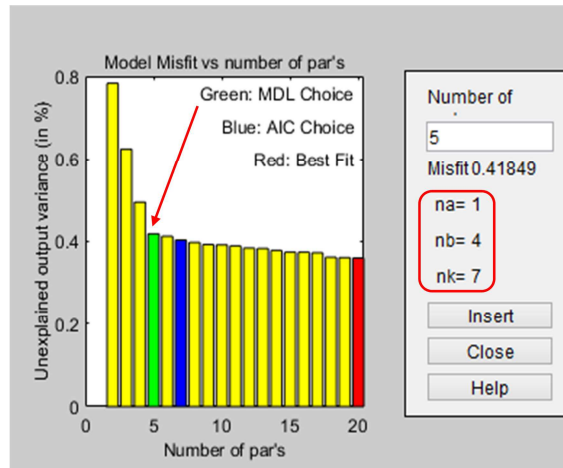


Figure 12. Façade 3. ARX model structure

According to Figure 13, the model ARX was stable since all zeros and poles were located inside the unit circle. The frequency function does not show signals of instability for a simple model structure. However, several peaks of resonance were detected as the complexity of the model increased (Figure 14), when the structure of the red bar (Figure 12) was chosen. In the ACF of the residuals, all observations were inside the 95% confidence interval bands (Figure 15).

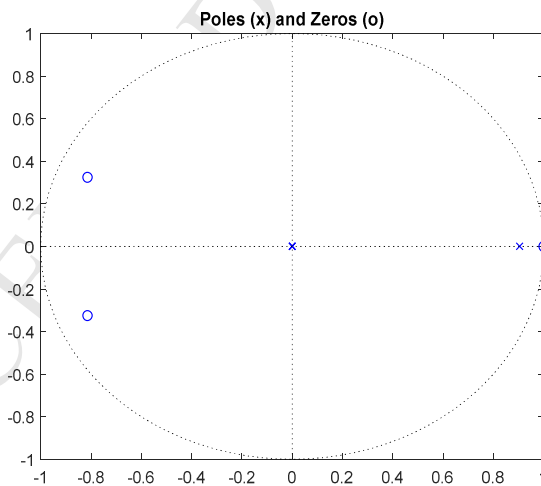


Figure 13. Zeros and poles plot for façades F3

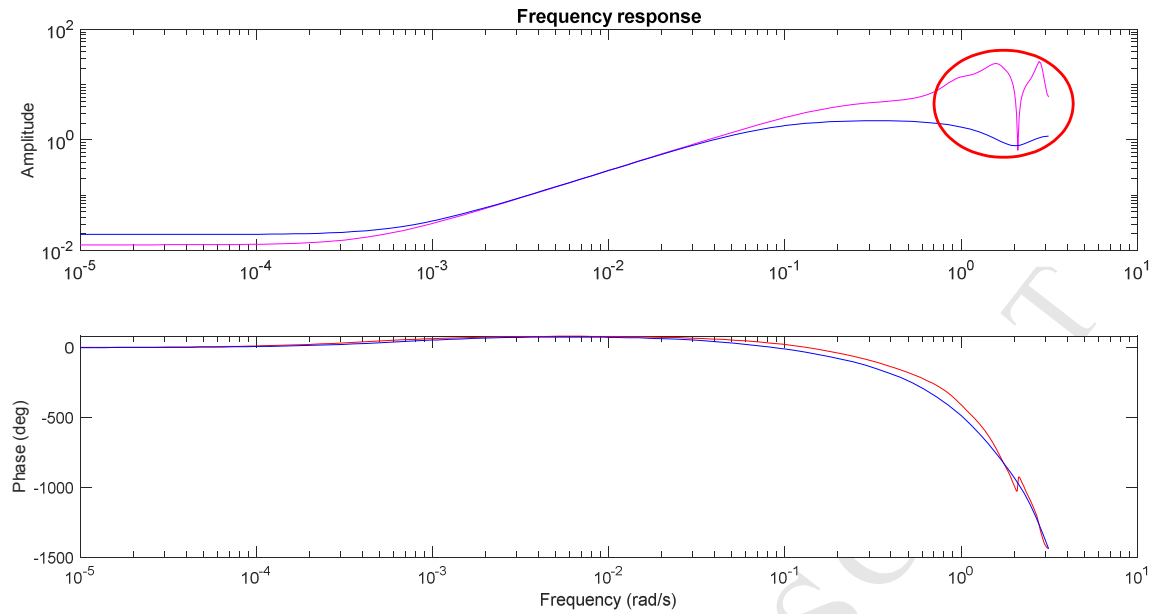


Figure 14. Frequency response for F3. Peaks of resonance when the complexity of the model increased

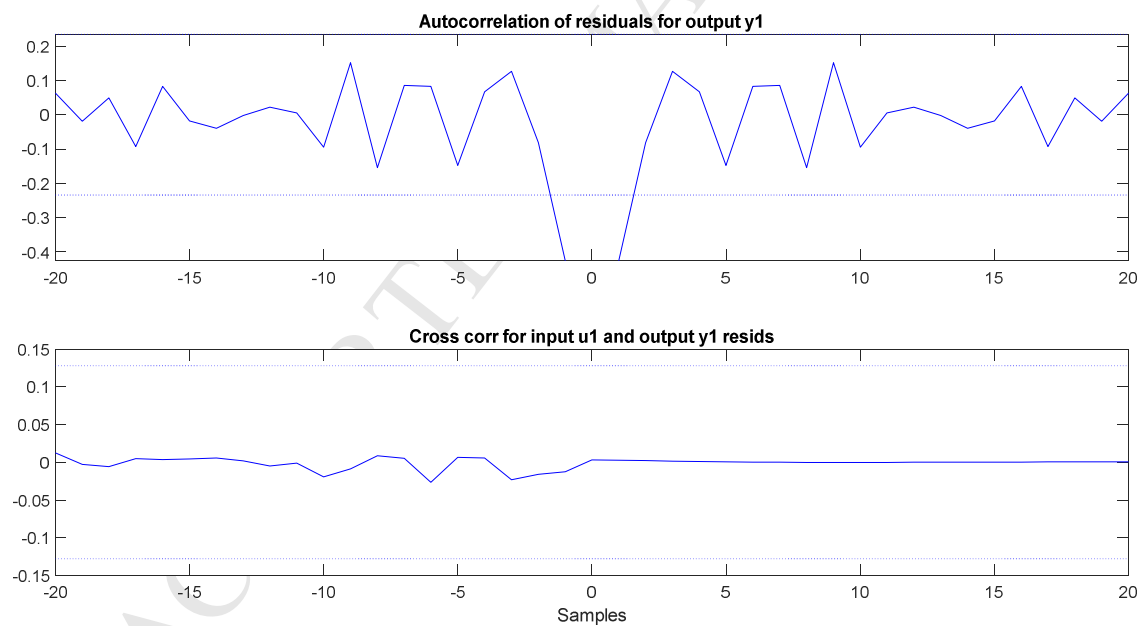


Figure 15. ACF of residuals for façades F3

As regards the comparative analysis between the developed signal models and IRT measurements, the results are shown in Figures 17–22 and Table 4. In the plots, it can be observed that: the theoretical thermal transmittance and the margin of error ( $\pm 5\%$ ) were indicated with a discontinuous red line; the measured IRT signal was drawn in black; and the modelled signal was represented in different colours to

illustrate the behaviour of each wall when the second U-value time series analysis was applied. MATLAB ensured that the system was an under stationary regime for all investigated buildings. In addition, the modelled signals were practically stable and continuous for  $30 \leq N \leq 120$  (Figures 17 to 22). Hence, and as the first U-value time series analysis had shown previously (Section 3.2), short-lasting tests could be executed.

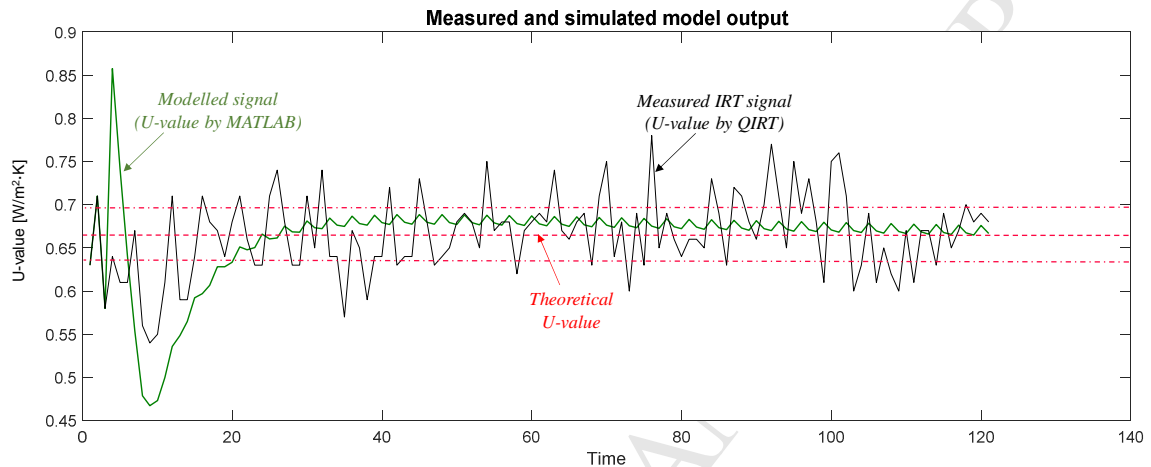


Figure 16. Façade 1. IRT measurements, theoretical U-value and MATLAB modelled signal

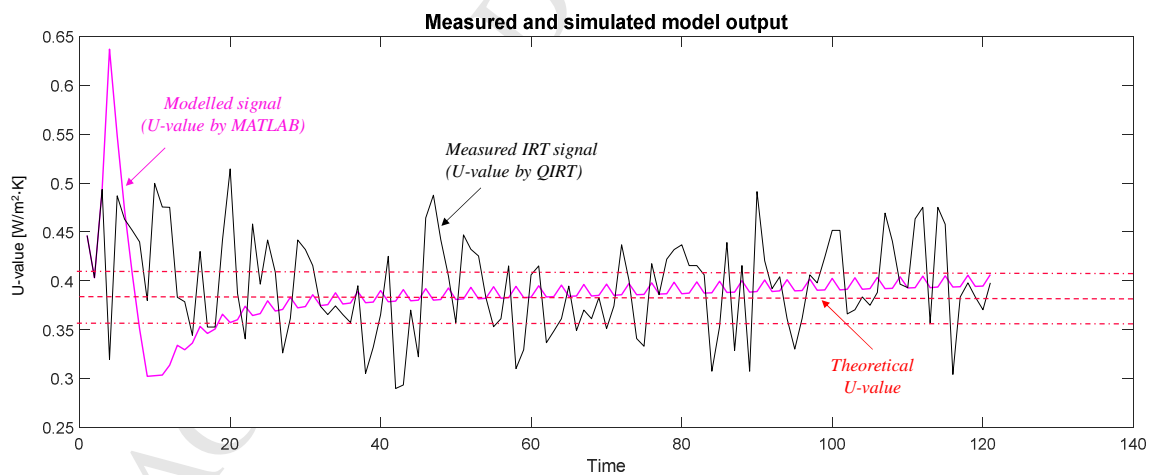


Figure 17. Façade 2. IRT measurements, theoretical U-value and MATLAB modelled signal



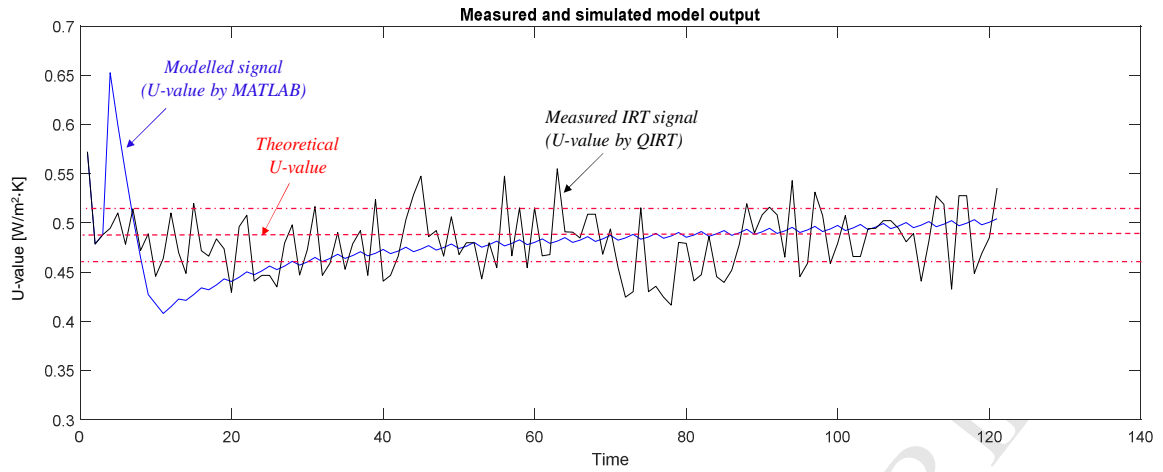


Figure 18. Façade 3. IRT measurements, theoretical U-value and MATLAB modelled signal

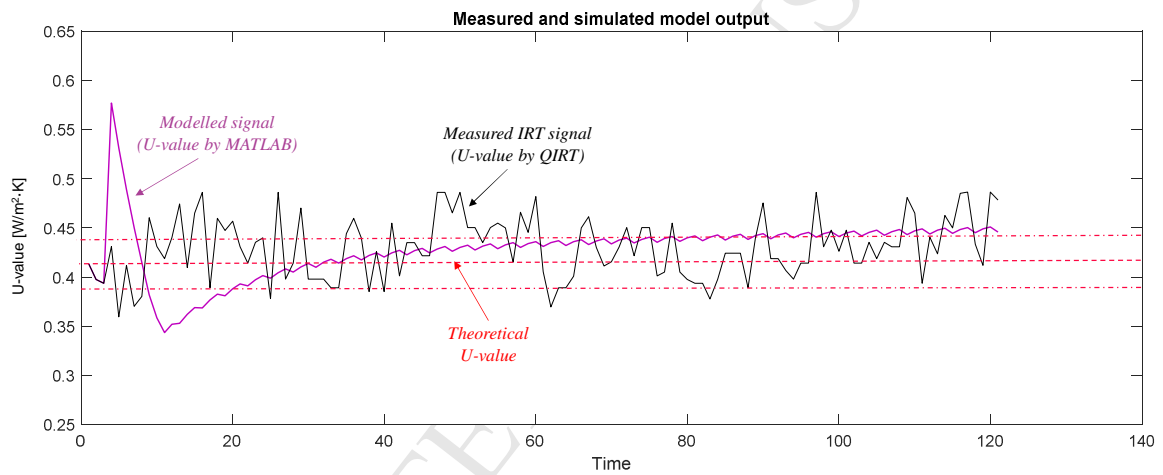


Figure 19. Façade 4. IRT measurements, theoretical U-value and MATLAB modelled signal

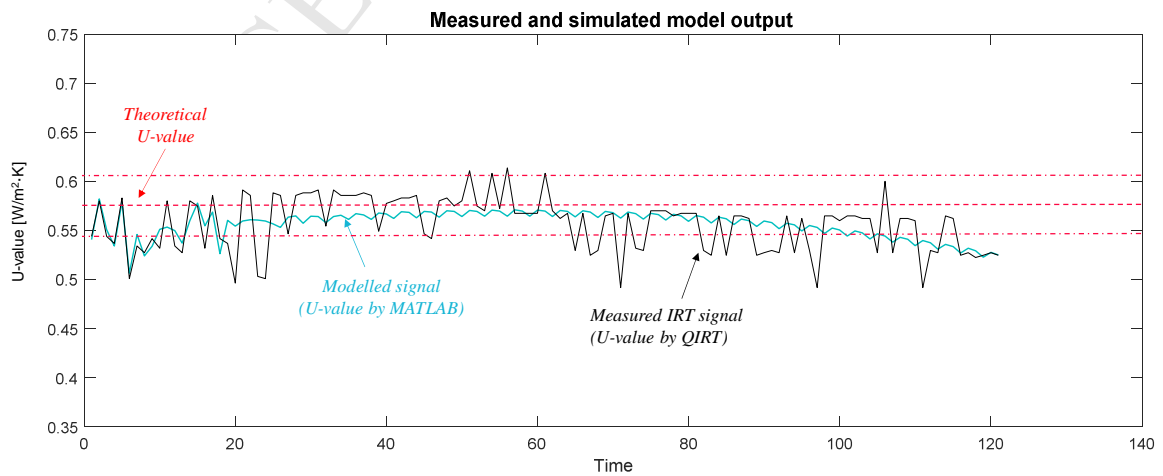


Figure 20. Façade 5. IRT measurements, theoretical U-value and MATLAB modelled signal

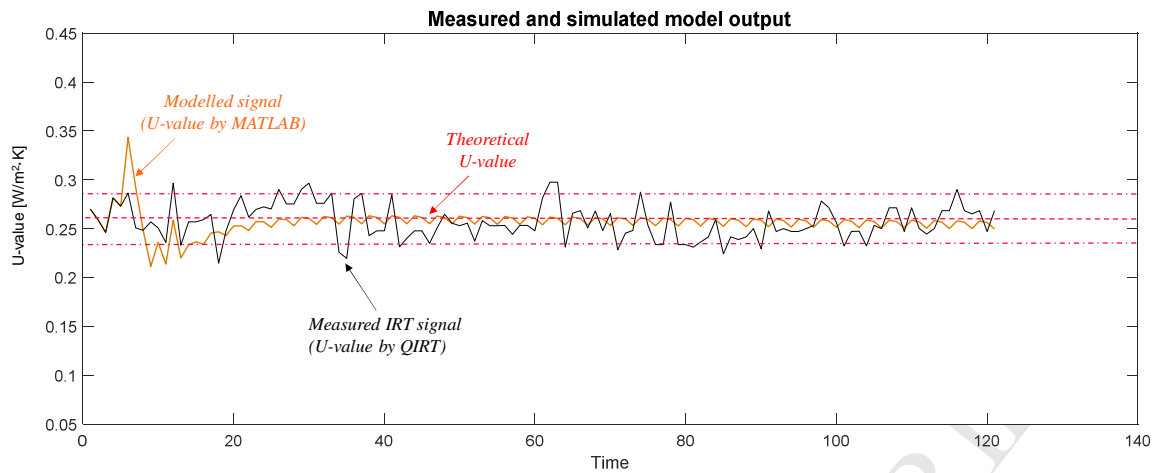


Figure 21. Façade 6. IRT measurements, theoretical U-value and MATLAB modelled signal

Besides this, the thermal transmittances estimated by the MATLAB ARX model and those obtained by the quantitative internal IRT method did not differ significantly among the three sampling durations. Indeed, the deviations between the theoretical and the MATLAB modelled signal ( $\Delta U_1/U_t$ ) as well as the deviations between the theoretical and the QIRT measured signal ( $\Delta U_2/U_t$ ) were found to be under 10% (Table 4; F1, F3 to F6). Therefore, the IRT survey could be stopped earlier than previous researches had adopted in the last few decades, since the errors are within an acceptable range.

Tejedor et al. [56] stated that heavy multi-leaf walls with low U-values might be difficult to measure. With the current research, it was observed that heavy multi-leaf walls with a low thermal transmittance and low heat capacity per unit of area (i.e. F2 and F6) require further research. As seen in Table 4, some discrepancies in terms of thermal behaviour were detected. In contrast to F6, where the deviations  $\Delta U_1/U_t$  and  $\Delta U_2/U_t$  were similar, F2 reached a deviation  $\Delta U_2/U_t$  around 15% for the measured IRT signal and a deviation  $\Delta U_1/U_t$  under 9% for the modelled signal. Therefore, the assembly of the wall layers and /or the type of material could play a greater impact on determination of the measured U-value than the test duration.

Table 4. Comparative analysis of modelled and original IRT signals

Case Studies	Time [min]	Modelled signal (MATLAB) $U_{MODEL}$ [W/m <sup>2</sup> ·K]	Measured signal (QIRT) $U_{MES\_AVG}$ [W/m <sup>2</sup> ·K]	Theoretical U-value (Standards) $U_t$ [W/m <sup>2</sup> ·K]	$\Delta U_1/U_t$ [%]	$\Delta U_2/U_t$ [%]
F1	120	0.675	0.665	0.657	2.74	1.22
	60	0.687	0.654		4.57	0.46
	30	0.681	0.645		3.65	1.83
F2	120	0.394	0.396	0.362	8.84	9.39
	60	0.383	0.399		5.80	10.22
	30	0.374	0.418		3.31	15.47
F3	120	0.497	0.481	0.480	3.54	0.21
	60	0.484	0.481		0.83	0.21
	30	0.468	0.480		2.50	0.00
F4	120	0.461	0.430	0.420	9.76	2.38
	60	0.455	0.431		8.33	2.62
	30	0.430	0.425		2.38	1.19
F5	120	0.550	0.557	0.586	6.14	4.95
	60	0.562	0.566		4.10	3.41
	30	0.545	0.554		5.46	5.46
F6	120	0.256	0.257	0.252	1.59	1.98
	60	0.260	0.260		3.17	3.17
	30	0.260	0.265		3.17	5.16

$U_{MODEL}$ : modelled signal of thermal transmittance estimated by the MATLAB ARX model;  $U_{MES\_AVG}$ : measured thermal transmittance determined by quantitative internal IRT following Section 3.2;  $U_t$ : theoretical thermal transmittance;  $\Delta U_1/U_t$ : deviation between the theoretical and modelled U-value;  $\Delta U_2/U_t$ : deviation between the theoretical and measured U-value

Notably, the U-value of Façade F5 was significantly underestimated for both the modelled and measured IRT signal. In this occupied residential building, the temperature difference ( $\Delta T$ ) ranged from 18.30°C to 19.60°C. According to Tejedor et al. [56], the variance of the measured U-value could be attributed to changes in the wall surface temperature ( $T_{WALL}$ ) when  $16^\circ\text{C} < \Delta T < 21^\circ\text{C}$ , reaching deviations of the measured U-value of around -15%. Hence, aspects related to the influence of operating conditions on the determination of the thermal transmittance of the current research were consistent with previous studies.

### 3.4. Proposal for stopping IRT tests

According to the comparative analysis of Section 3.3., and in terms of applicability, a routine in basis on statistical tests could be proposed to stop quantitative IRT tests (Figure 22). It was demonstrated that algorithms focused on statistical analysis (i.e. ACF and CP) might be more reliable and accurate than those mathematical procedures based on modelled signals (Table 4).

Future automation of the system could consist of adding one thermographic image each  $t+1'$  once the premise of  $N \geq 30$  has been reached. As represented in Figure 22, the algorithm is initiated by implementation of the quantitative internal IRT method. The measuring equipment monitors and records environmental conditions (inner and outer air ambient temperature) and the parameters related to the façade ( $\epsilon_{\text{WALL}}$ ,  $T_{\text{WALL}}$  and  $T_{\text{REF}}$ ). With a minimum time delay, a first data package of 30 measurements (one image per minute) will be introduced into the numerical model to determine in-situ instantaneous thermal transmittances. To fulfil the hypothesis (*U-value is a constant signal plus white noise*) and stop the IRT survey, the residuals of the measured signal should be located inside the 95% confidence interval bands for the ACF and CP. Regarding variability among IRT measurements and after calculating the statistical parameters specified in Section 2.2, CV should be  $\leq 10\%$  and  $\sigma$  should range between 0.01 and 0.05  $\text{W/m}^2 \cdot \text{K}$ . Otherwise, one image needs to be added to the routine.

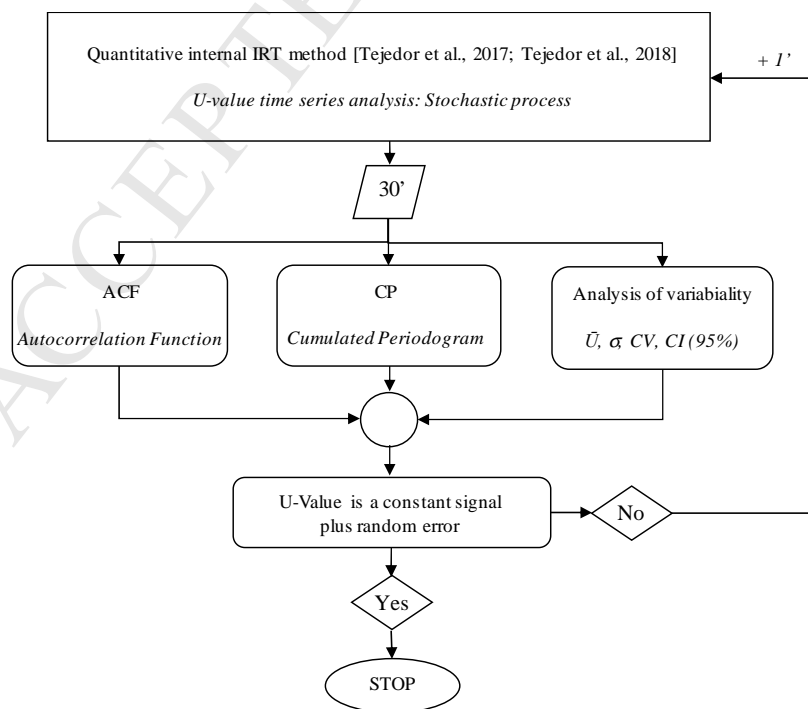


Figure 22. Flowchart of the routine for stopping IRT tests

#### 4. CONCLUSIONS

In the recent decades, the usual approach adopted for this NDT is based on manually post-processing from 120 to 7200 thermograms for data acquisition intervals of 1 minute to 1 second respectively. This entails both a reduction of effectiveness and a lack of robustness to determine the measured thermal transmittance.

For the first time, a research allowed to demonstrate the feasibility of performing short-lasting IRT tests by means of two U-value time series analyses (statistical tests and the MATLAB signal modelling technique). The main reasons are exposed as follows. Firstly, no significant differences were detected among sampling durations (30, 60 and 120 minutes) for the estimation of in-situ thermal transmittance. Hence, long-lasting tests do not necessarily lead to lower errors, in contrast to the usual assumption about test duration adopted in previous studies. Secondly, the number of quantitative IRT measurements could be reduced in all investigated buildings and consequently, reliable U-values could be achieved in a shorter analysis time. Thirdly, the IRT test could be stopped earlier (from 30 minutes). As a conclusive remark, this research underlined that techniques such as ACF or CP and signal modelling by MATLAB can be used to verify whether non-transient conditions have been fulfilled during on-site construction surveys.

The findings also suggested that the sampling duration might be a minor source of discrepancy in the determination of measured U-values, compared to the influence of operating conditions and thermophysical properties reported by Tejedor et al. [56].

In terms of applicability, this research leads us to propose an innovative data management tool for stopping quantitative IRT tests when the results of the measured U-value present a high trustworthiness. The routine should be focused on assuming instantaneous measured thermal transmittances as a stochastic process constituted by a constant signal plus white noise, regardless of the internal wall configuration.

This aforementioned proposal could allow the NDT to be automated in the mid-term, helping to advance the standardization of quantitative IRT for heavy multi-leaf walls: (i) a common measurement pattern could be drawn up; (ii) the data analysis could be simplified. In this way, the entire procedure would become more efficient and could be incorporated into the industrial market as a building diagnosis tool to

facilitate decision –making in real built environments. Tests of 120 minutes might be used in energy audit procedures while tests of 30 minutes could be implemented to evaluate the state of the building in a walk-through survey in terms of periodic maintenance controls. Nevertheless, further research is required to analyse more wall types and the influence of climate on external façades or observe if future studies by other researchers are in line with the conclusions posed in this journal paper.

## ACKNOWLEDGEMENTS

The authors would like to thank the Industrial Engineers' Institution of Catalonia and Terrassa City Council for promoting this research. The authors also express their gratitude to the Department of Housing and Urban Development of Terrassa for allowing access to council-owned buildings. Finally, the authors acknowledge Evowall Technology for allowing measurement of the building mock-up with a low U-value and for facilitating the monitoring process.

## CONFLICT OF INTEREST

The authors have no conflict of interest

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- A gap in standardization of quantitative IRT was detected
- Research was undertaken in six real built environments
- Measured U-values might be assumed as a constant signal plus white noise
- 30 minutes could be enough to obtain reliable results of in-situ measured U-values
- A routine for stopping quantitative IRT tests in real time is proposed